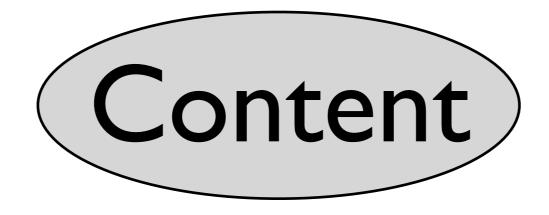
#### A Lattice Theory to Solve Games of Imperfect Information

#### J.-F. Raskin Université Libre de Bruxelles

Joint work with M. De Wulf, L. Doyen

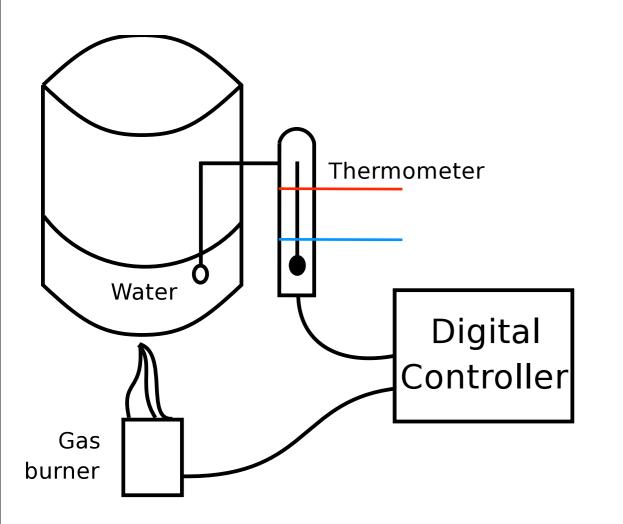




- Controller synthesis : context motivations
- Two-player game structures Safety games (of perfect information)
- Imperfect information: motivations
- The lattice of antichains CPre
- Applications : discrete time control of RHA, universality problem of NFA
- Conclusion & perspectives

# Context - Motivations

### Embedded systems



Hybrid systems mixe **discrete** and **continuous** components : non trivial interactions

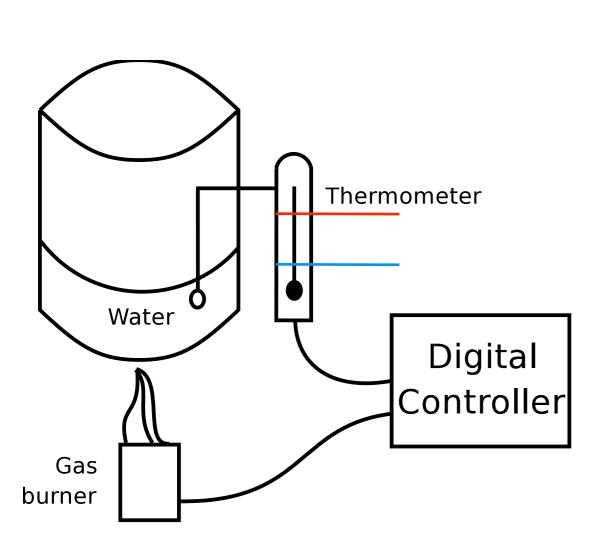
#### difficult to develp

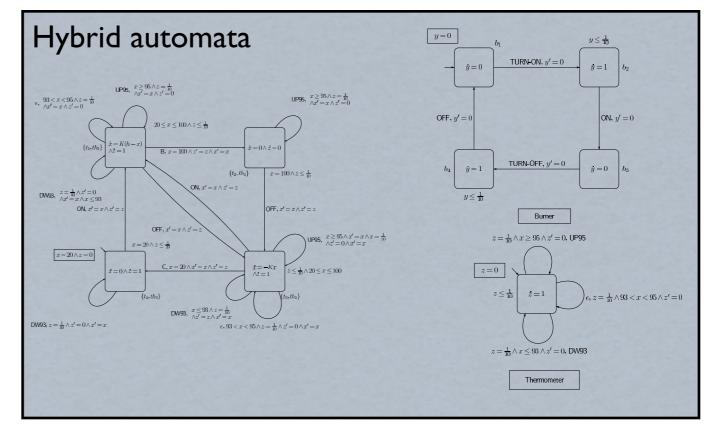
They are often **safety critical** 

#### need for formal methods



### **Controller** Verification



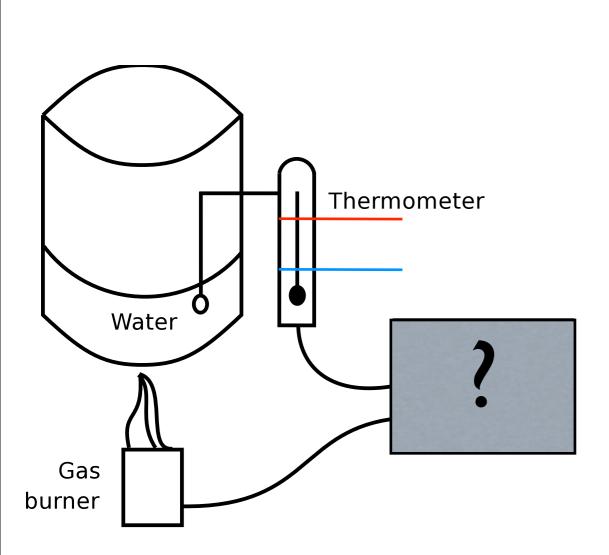


satisfies ?  $\Box(\mathsf{low} \le x \le \mathsf{high})$ 

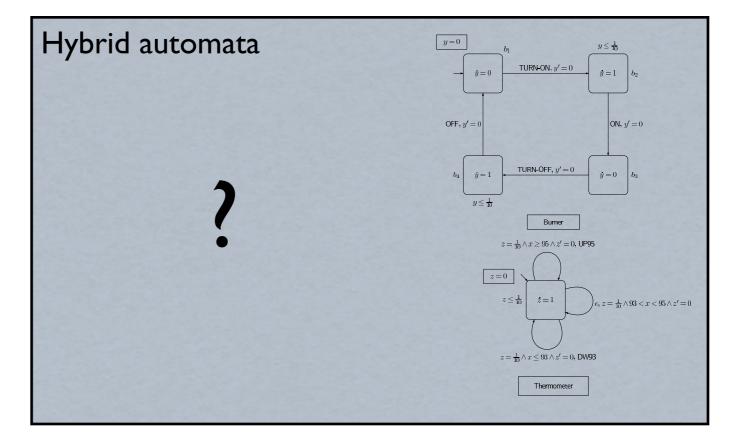


Math. model

### **Controller Synthesis**







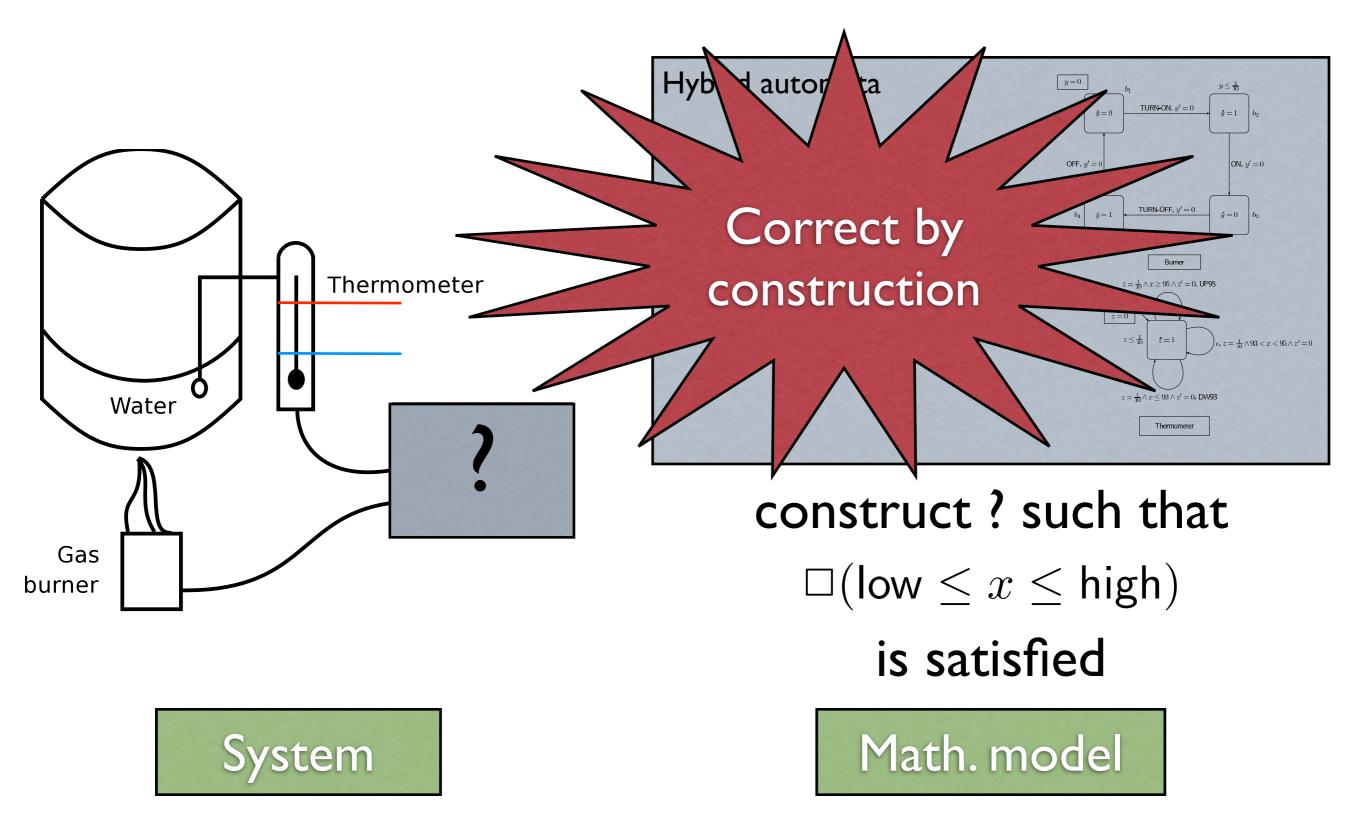
### construct ? such that

 $\Box(\mathsf{low} \le x \le \mathsf{high})$ 

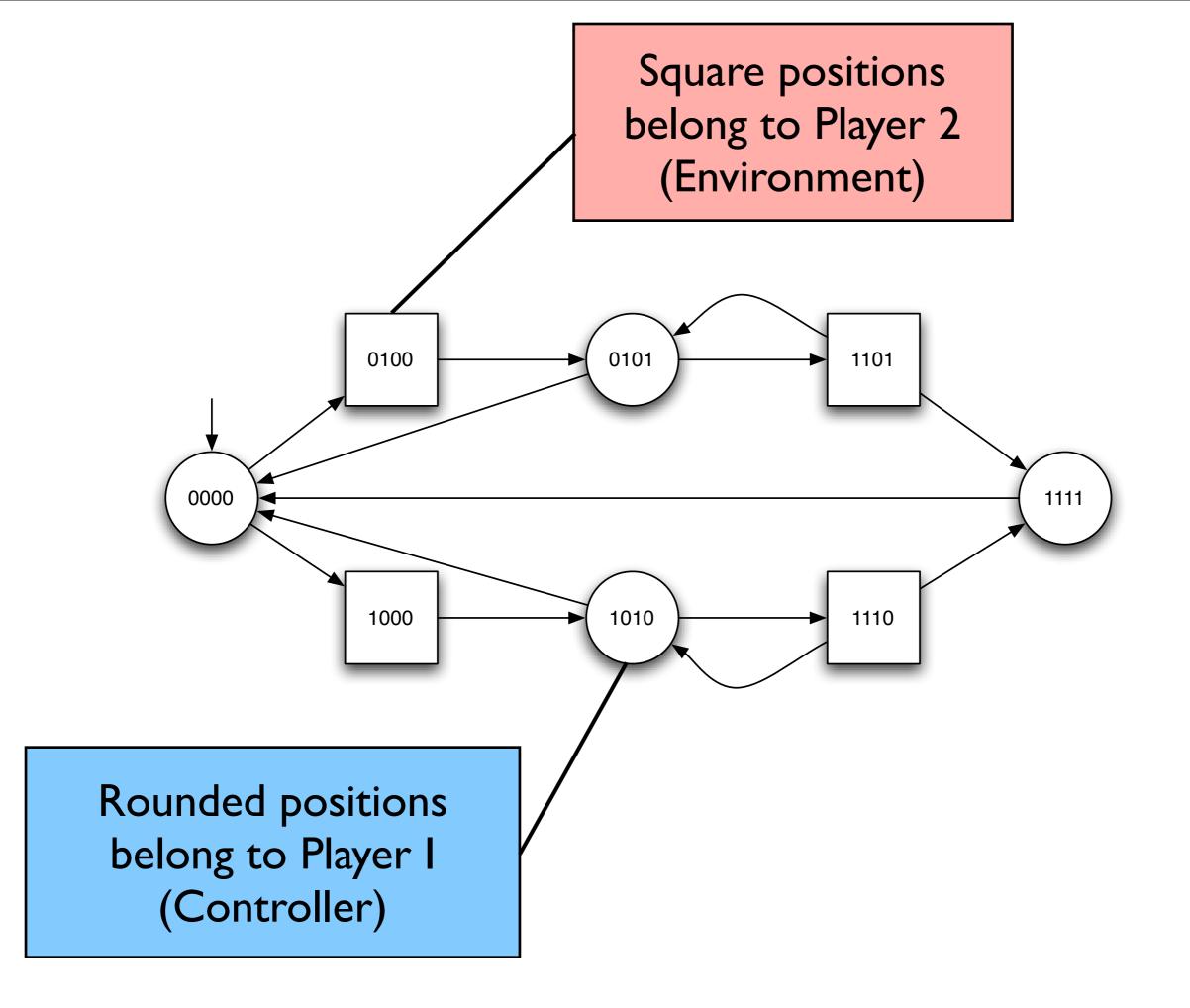
is satisfied

Math. model

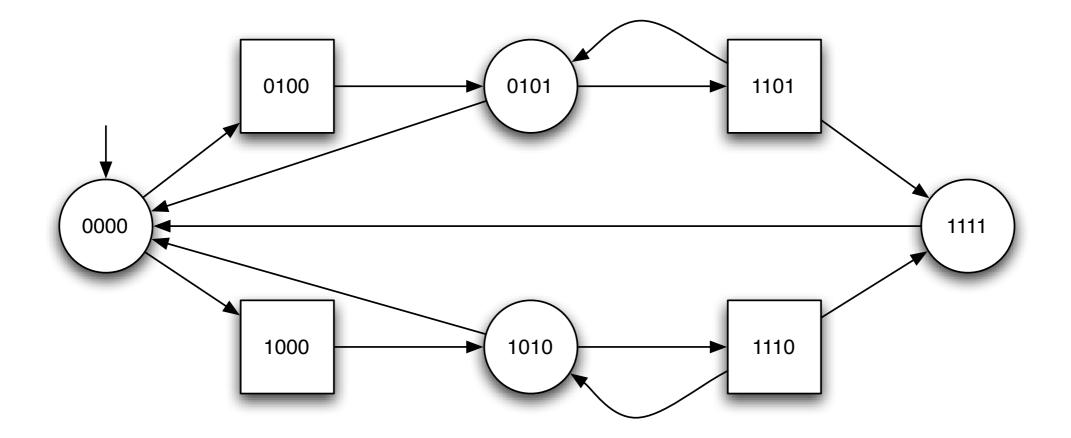
### **Controller Synthesis**



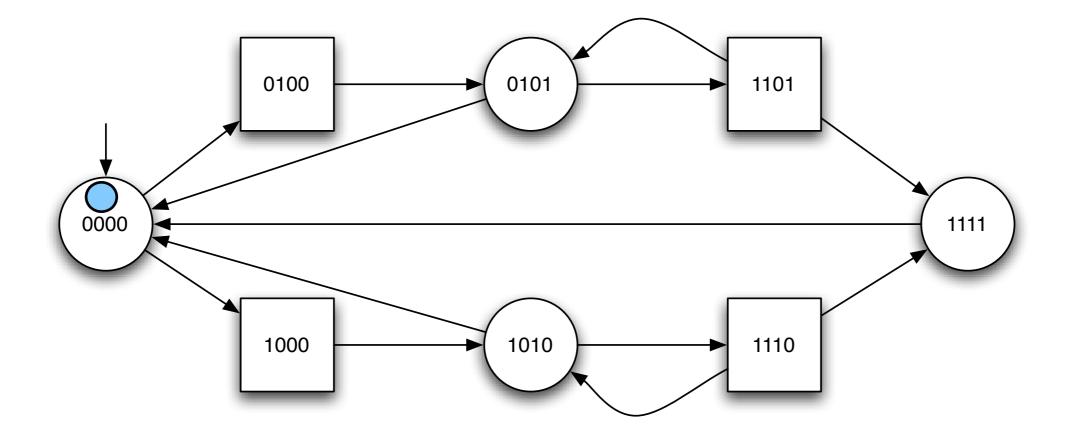
# Two-player game structures



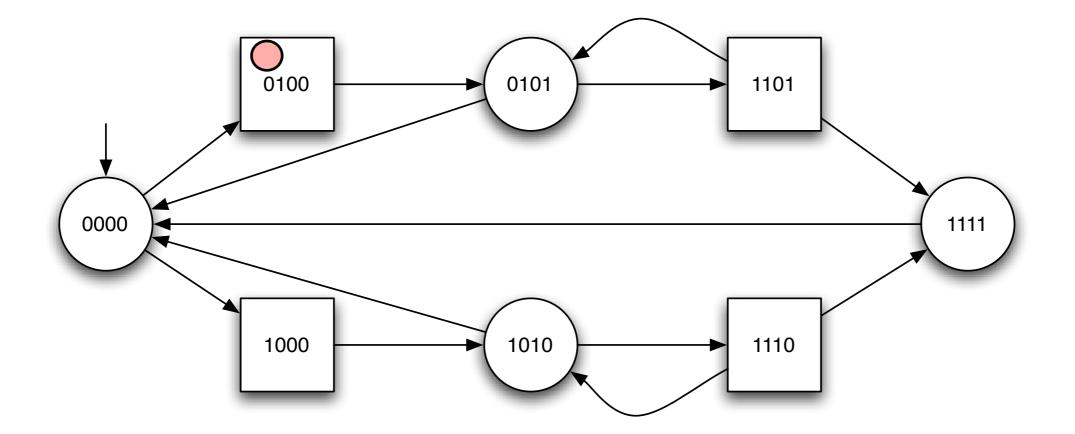
Rounded positions belong to Player I Square positions belong to Player 2



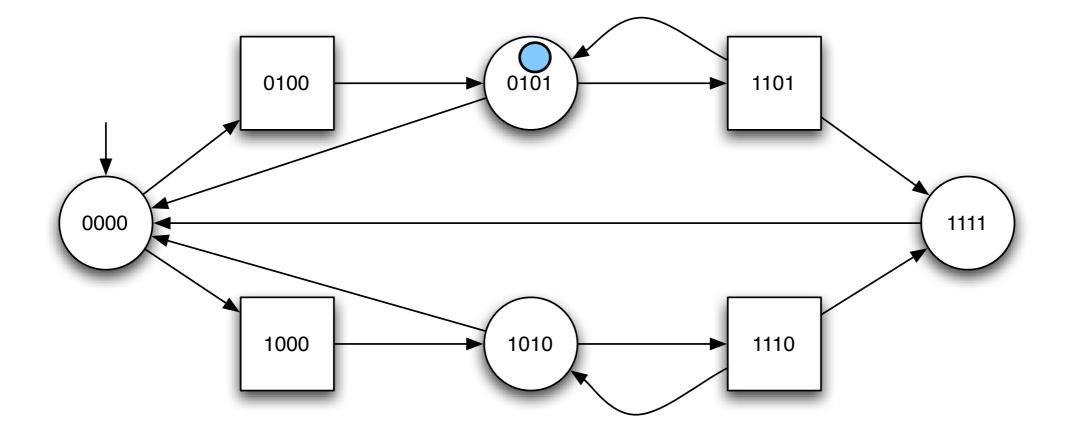
A game is played as follows: in each **round**, the game is in a **position**, if the game is in a rounded position, Player I resolves the **choice** for the next state, if the game is in a square position, Player 2 resolves the choice. The game is played for an **infinite number of rounds**.



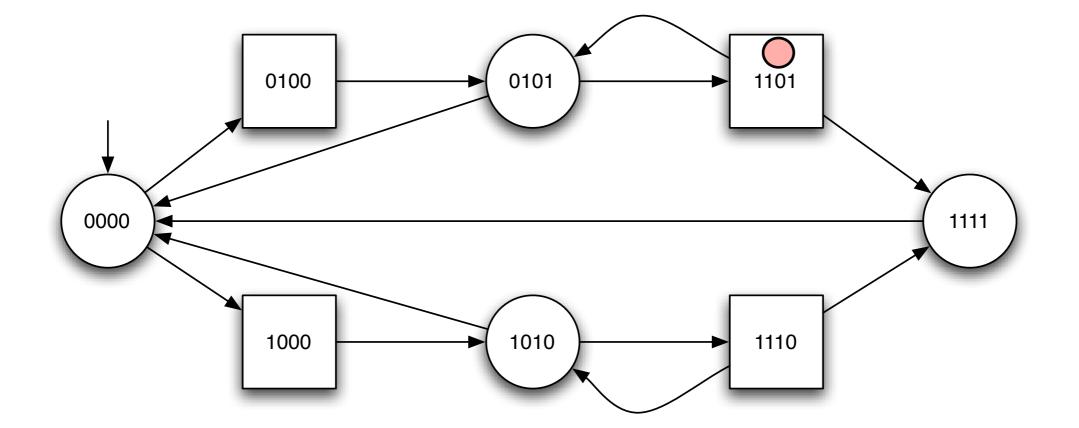
Play : 0000



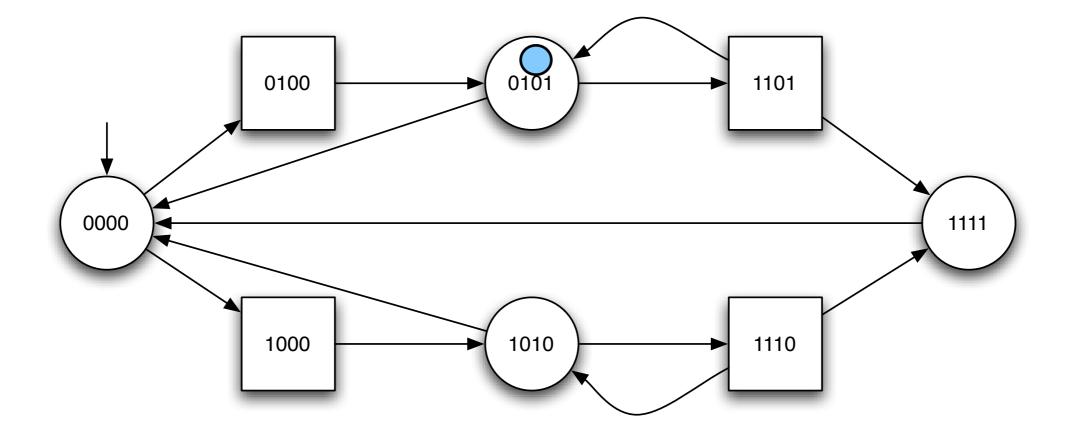
#### Play : 0000 0100



#### Play : 0000 0100 0101

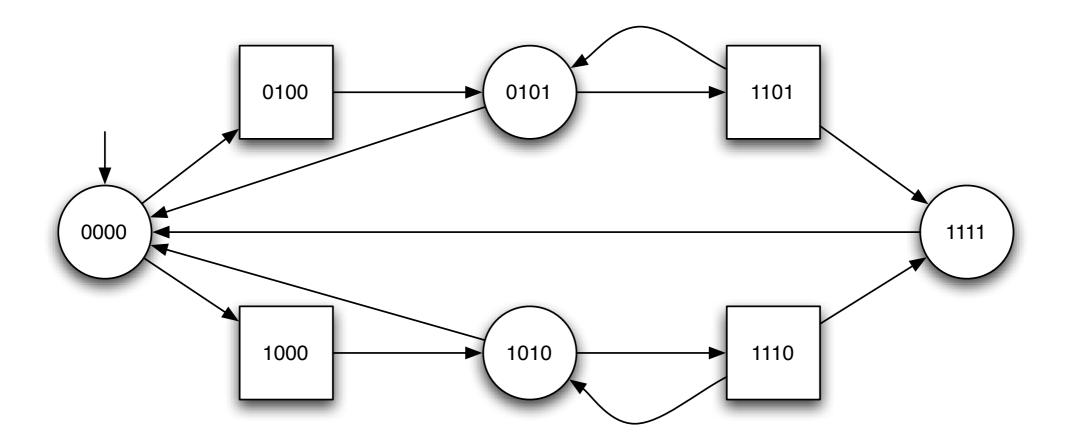


#### Play:0000 0100 0101 1101



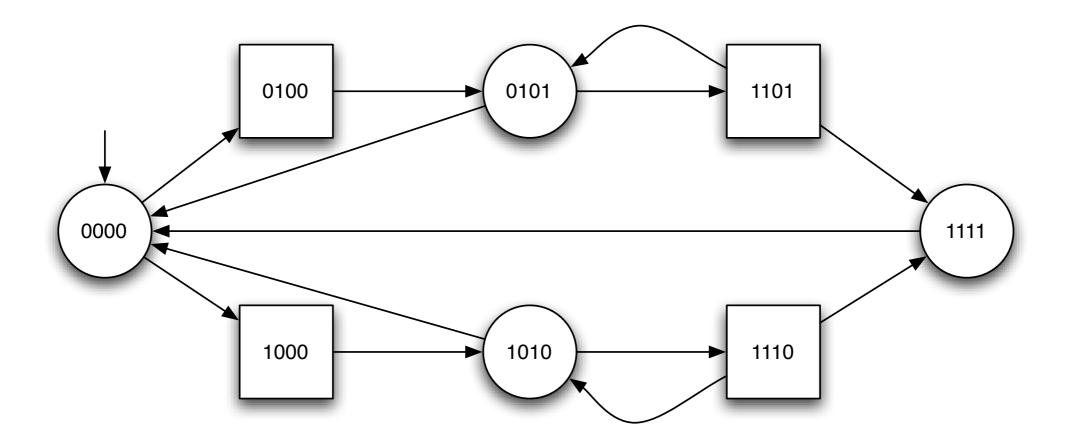
#### Play:0000 0100 0101 1101 ...

#### Who is winning ?



#### Play:0000 0100 0101 1101 ...

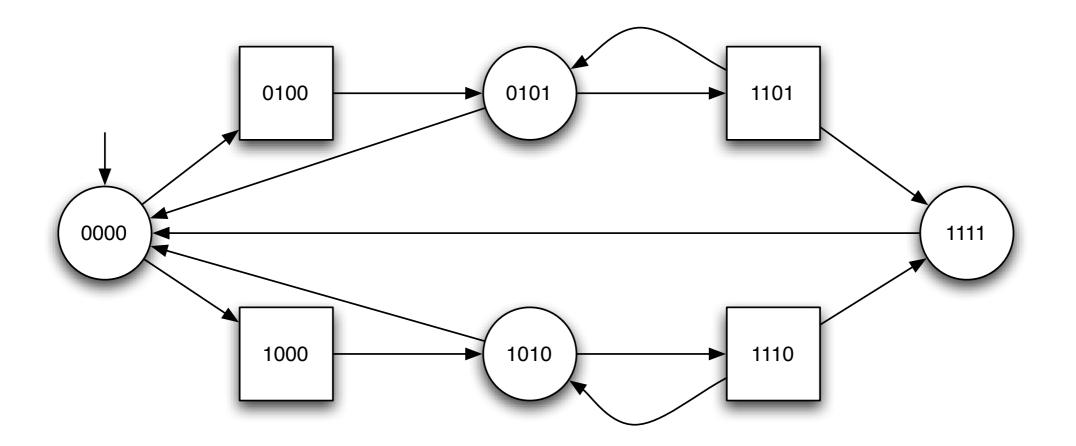
#### Who is winning ?



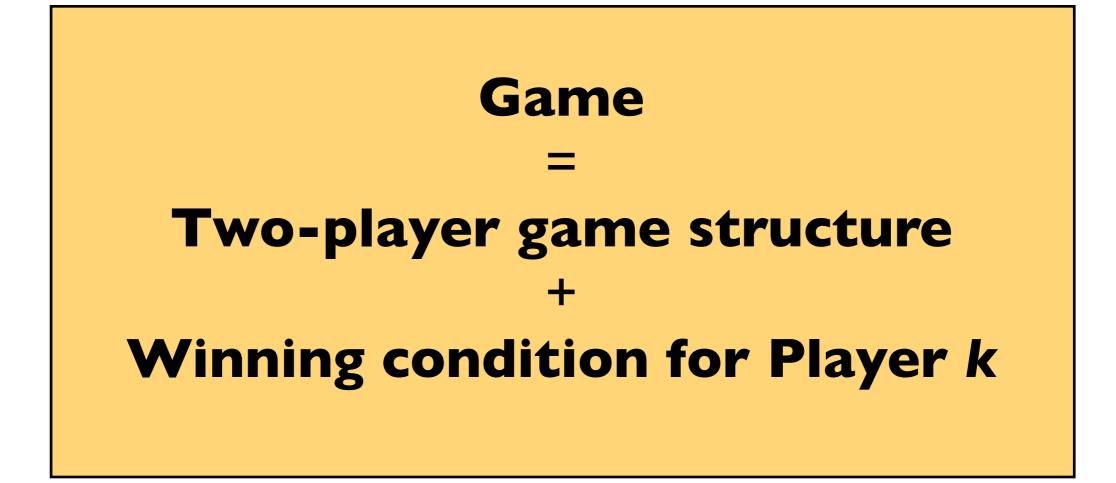
#### Play:0000 0100 0101 1101 ...

Is this a good or a bad play for Player k?

#### Who is winning ?



A winning condition (for Player k) is a set of plays  $W \subseteq (Q_1 \cup Q_2)^{\omega}$ 



## Strategies

Players are playing according to strategies.

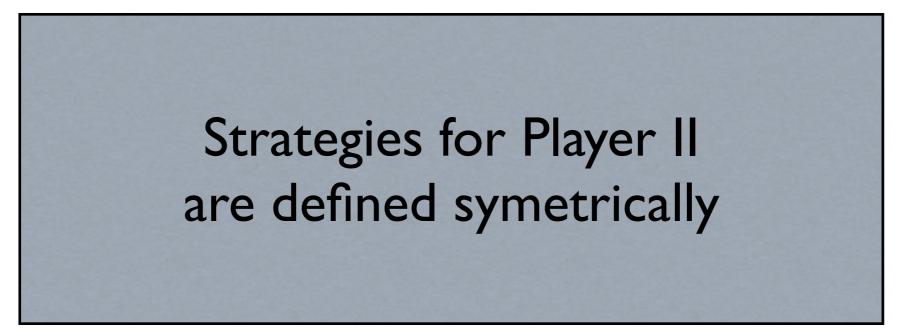
A **strategy for Player I** is a function that, given a sequence of positions (visited so far) that ends in a Player I's position, returns the choice for the next position.

 $\begin{array}{l} Player I's \\ position \\ \lambda_1(0011 \ 1001 \ 1101 \ 0011) = 1110 \\ \hline Choice for \\ the next position \end{array}$ 

## Strategies

Players are playing according to strategies.

A **strategy for Player I** is a function that, given a sequence of positions (visited so far) that ends in a Player I's position, returns the choice for the next position.



### Outcome of strategies

If we **fix** a strategy for the two players and we let the two players apply their strategies, we get a play:

If we fix a strategy **only** for Player I, we get a set of plays

Outcome(
$$\lambda$$
I)=  $\bigcup_{\lambda_2}$  Outcome ( $\lambda$ I, $\lambda$ 2)

A strategy for Player I is **winning** for objective W iff

$$Outcome(\lambda I) \subseteq W$$

### Outcome of strategies

#### A strategy for Player I is **winning** for objective W iff

$$Outcome(\lambda_1) \subseteq W$$

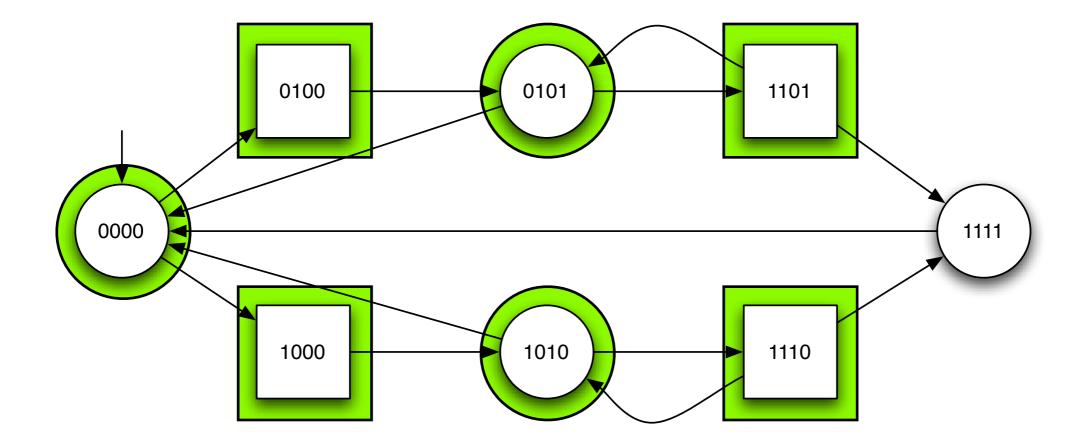
That is, no matter how Player II resolves his choices, when player I **plays according to**  $\lambda$ I the resulting play belongs to W.

Player I can **force** the play to be in W.



## Safety Games

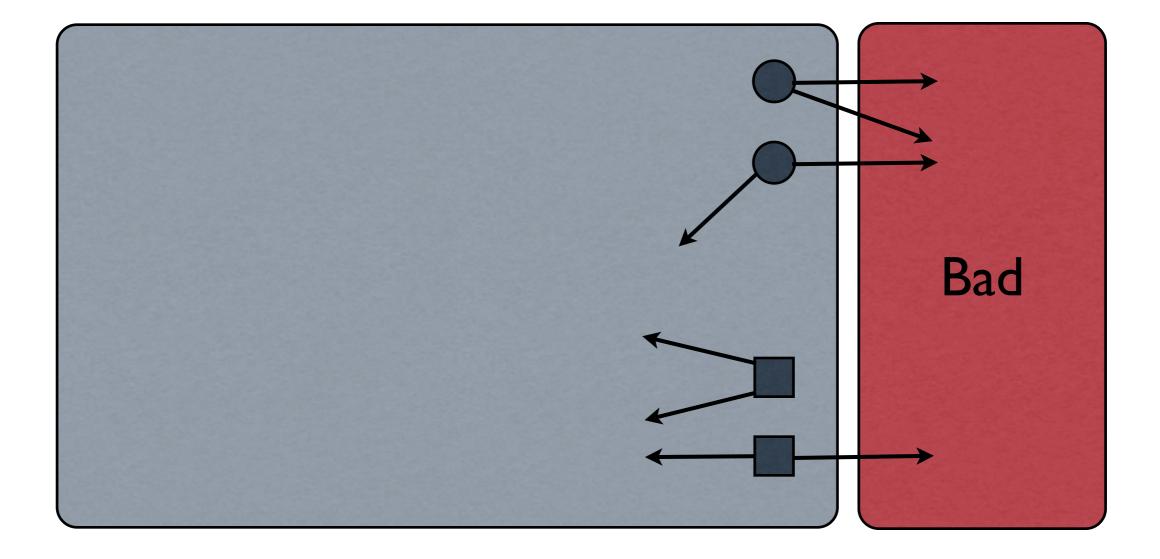
A Safety Game

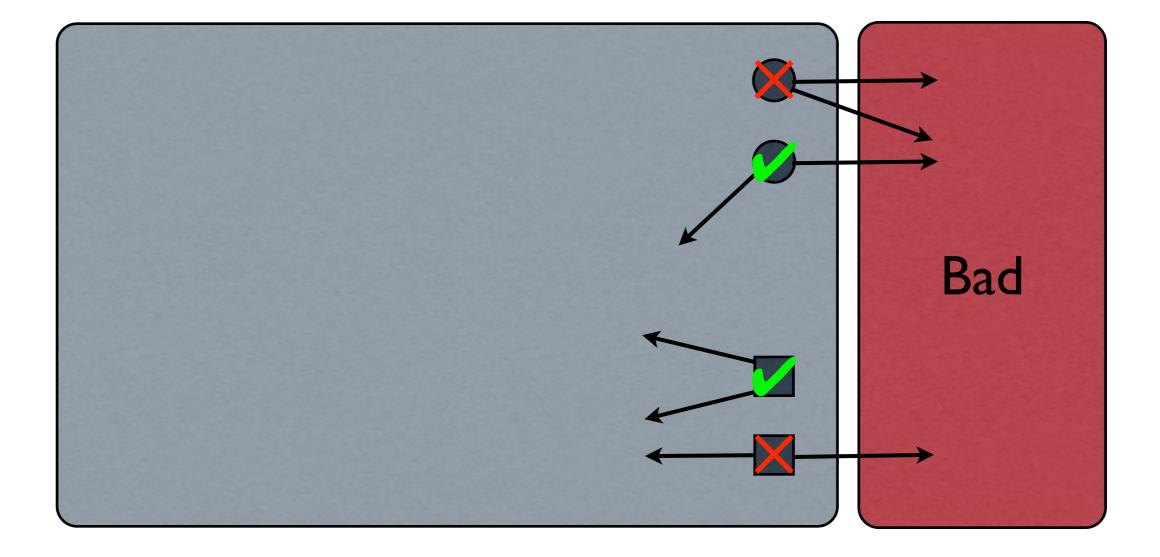


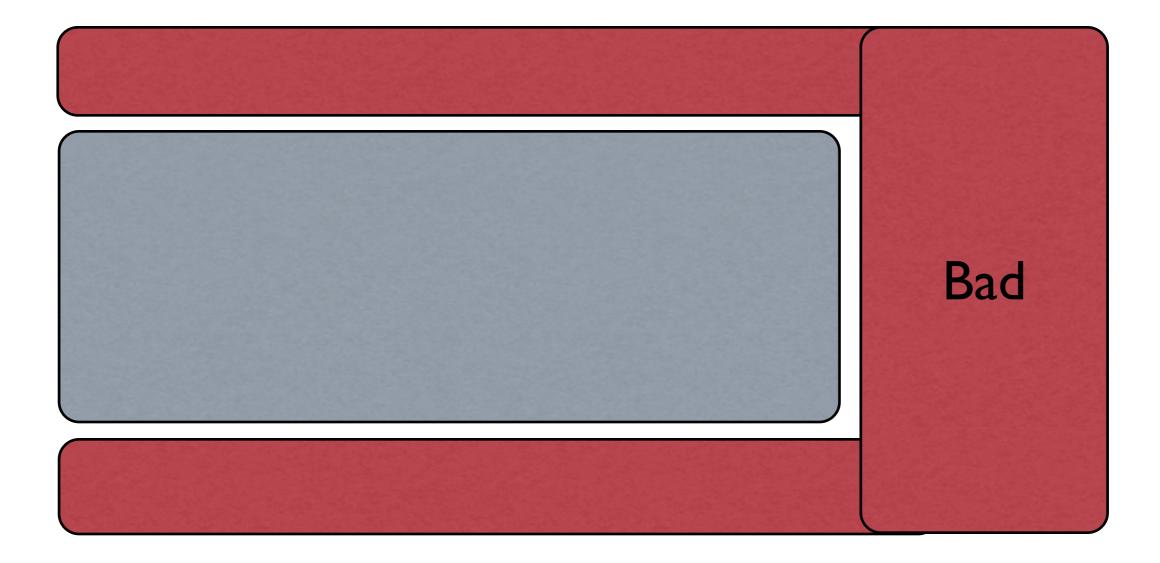
Does Player I, who owns the rounded positions, have a strategy (against any choices of Player II) to stay within the set of states

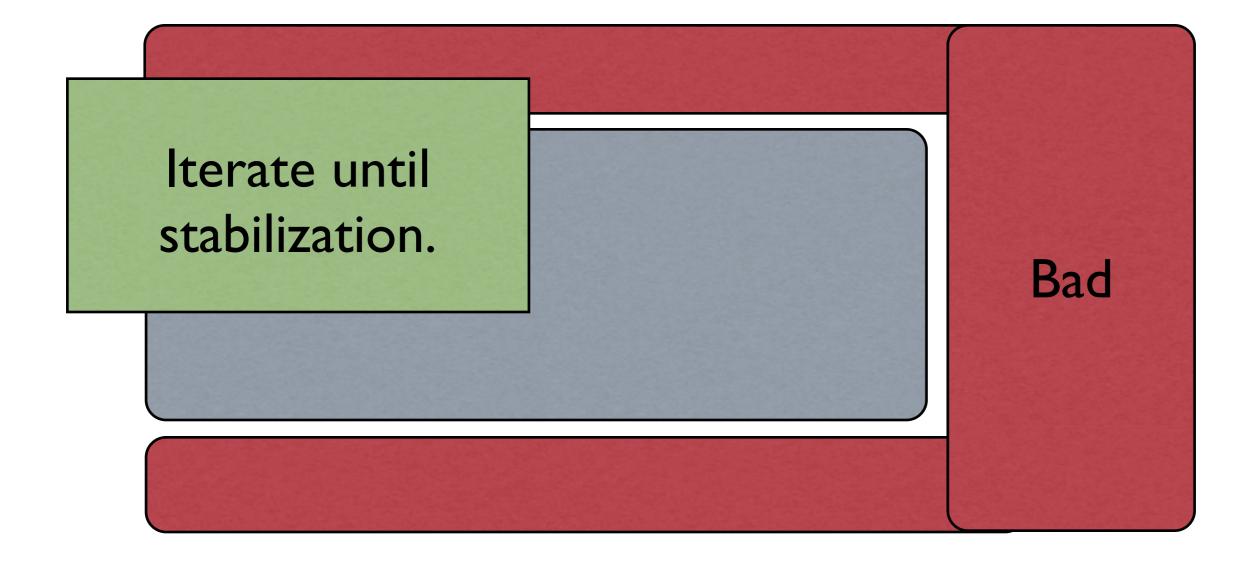


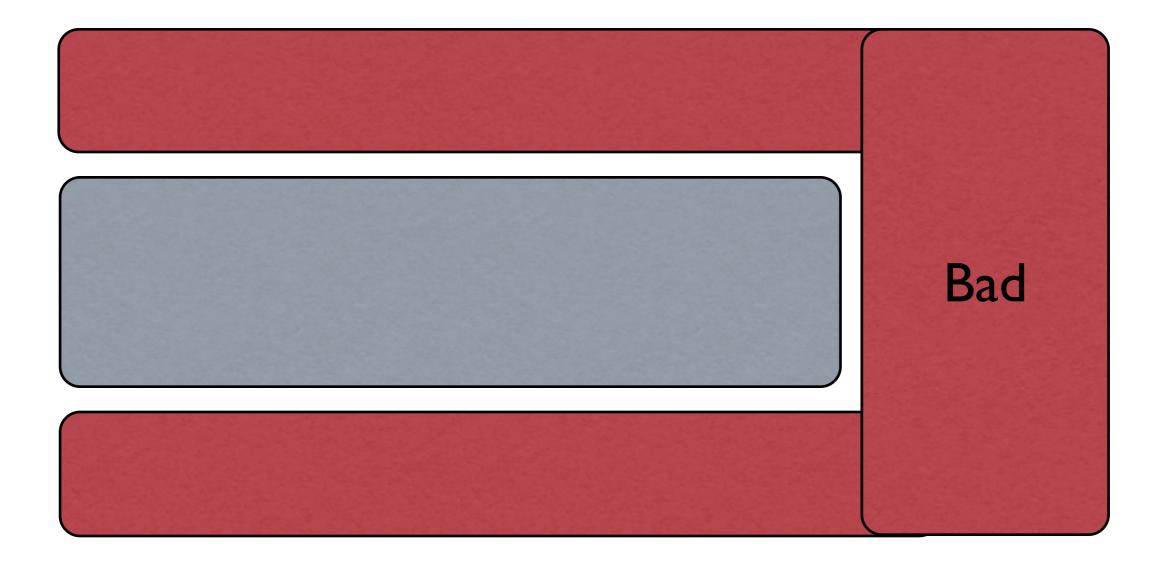
# Symbolic algorithms to solve games

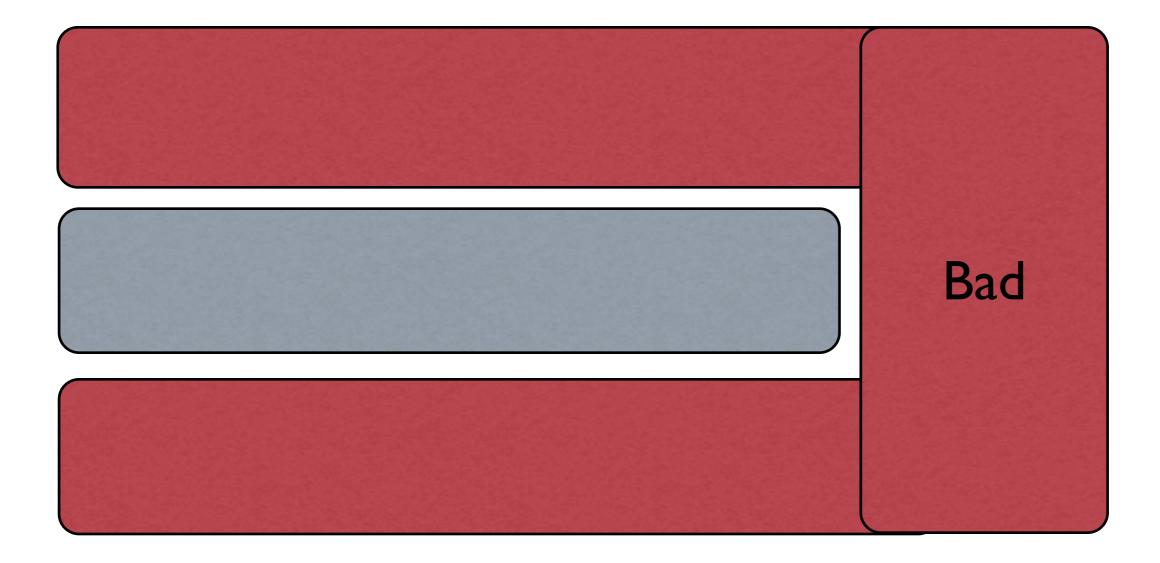


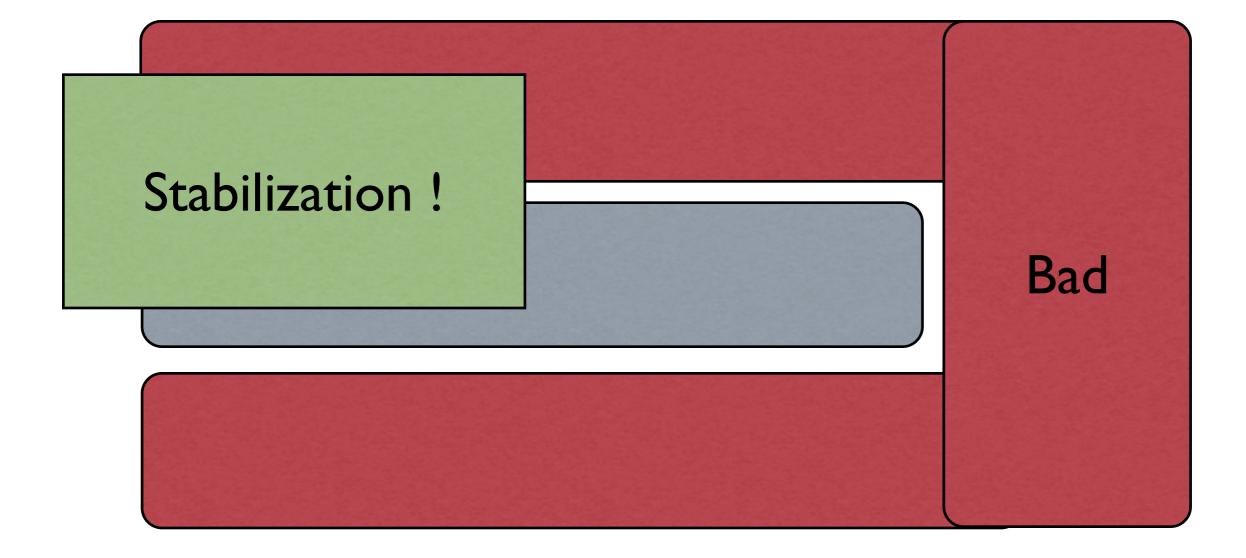


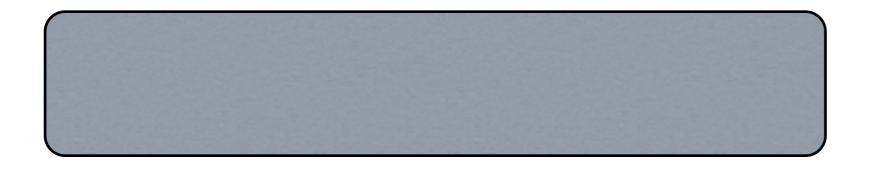












This is exactly the set of states where Player I has a strategy to avoid the bad states.

Player I Controllable  
predecessors  
$$X \text{ is a set of positions}$$
$$$$

Set of Player II positions where all her choices for successors lie in X

# Player I Controllable Predecessors

#### $\mathsf{1CPre}_G(X) = \{q \in Q_1 \mid \exists q' : \delta(q,q') \land q' \in X\} \cup \{q \in Q_2 \mid \forall q' : \delta(q,q') : q' \in X\}$

#### Symmetrically

 $2\mathsf{CPre}_G(X) = \{ q \in Q_2 \mid \exists q' : \delta(q, q') \land q' \in X \} \cup \{ q \in Q_1 \mid \forall q' : \delta(q, q') : q' \in X \}$ 

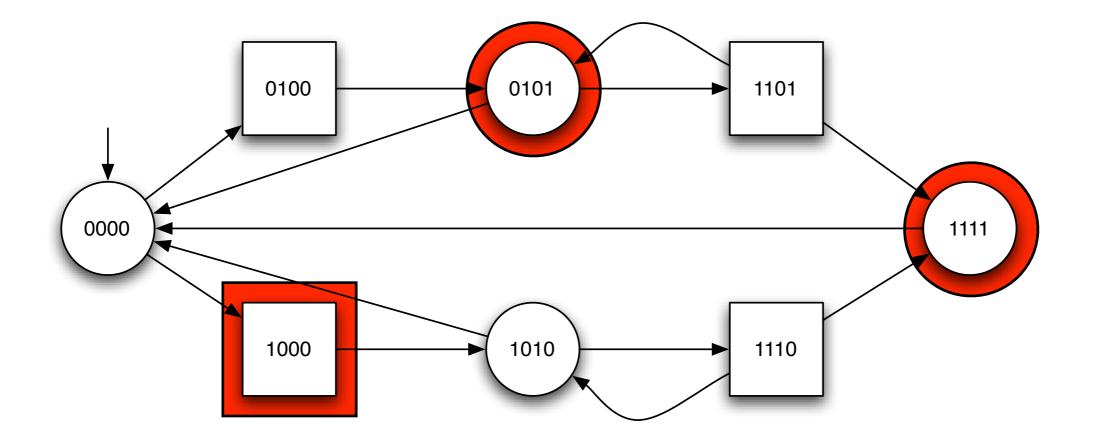
# Player I Controllable Predecessors

#### $\mathsf{1CPre}_G(X) = \{q \in Q_1 \mid \exists q' : \delta(q,q') \land q' \in X\} \cup \{q \in Q_2 \mid \forall q' : \delta(q,q') : q' \in X\}$

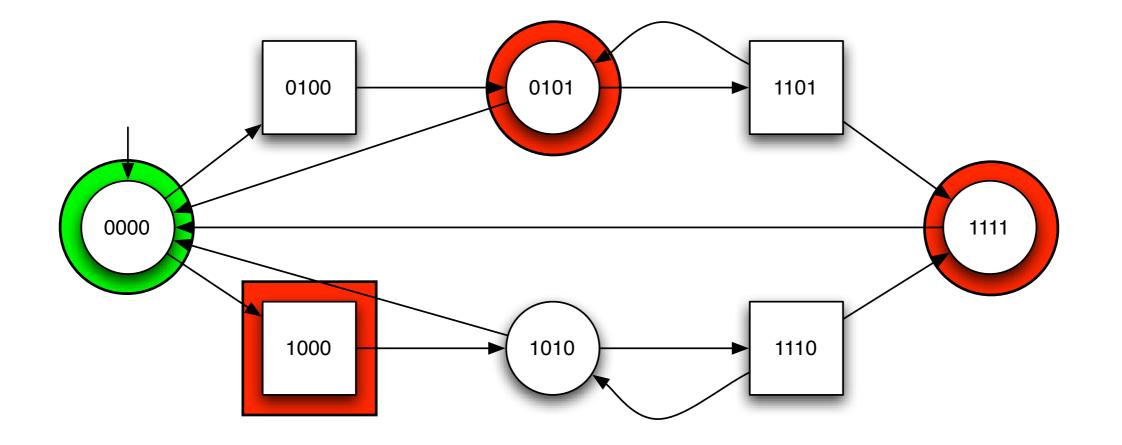
Monotonic functions over  $\langle 2^{Q_1 \cup Q_2}, \subseteq \rangle$ 

 $2\mathsf{CPre}_G(X) = \{ q \in Q_2 \mid \exists q' : \delta(q, q') \land q' \in X \} \cup \{ q \in Q_1 \mid \forall q' : \delta(q, q') : q' \in X \}$ 

Complete lattice

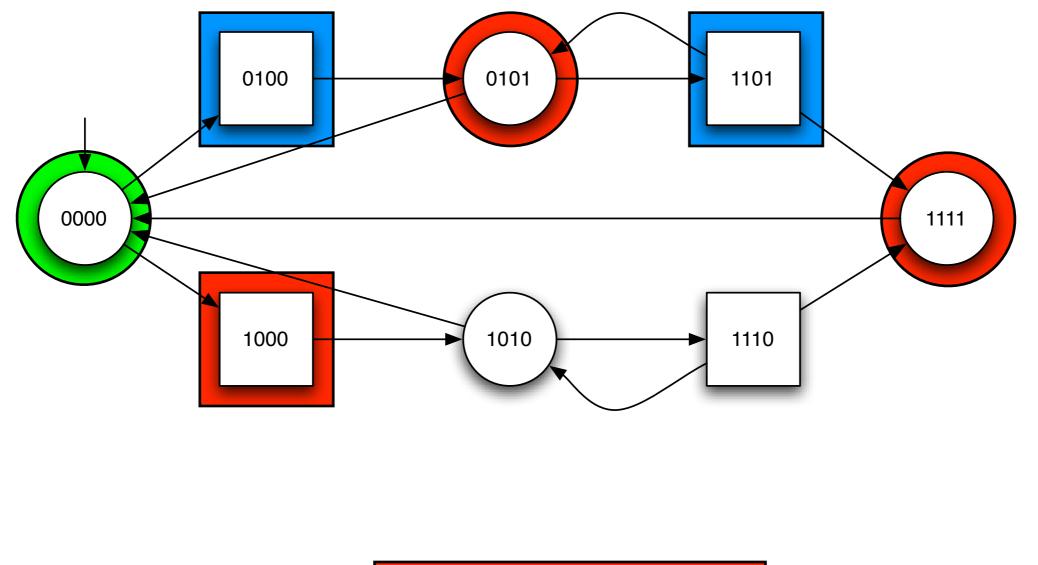


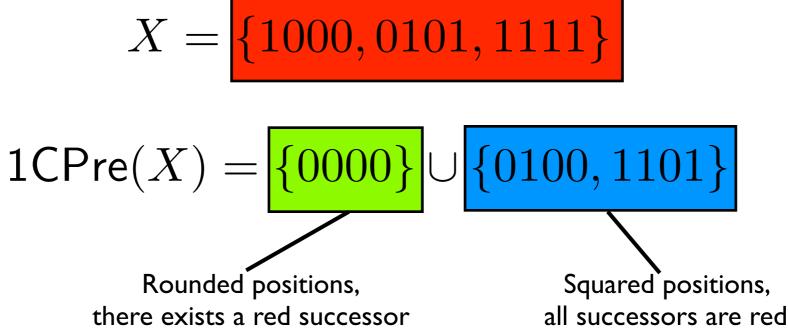
$$X = \{1000, 0101, 1111\}$$



$$X = \{1000, 0101, 1111\}$$
$$1\mathsf{CPre}(X) = \{00000\} \cup \{0100, 1101\}$$
Rounded positions,

there exists a red successor

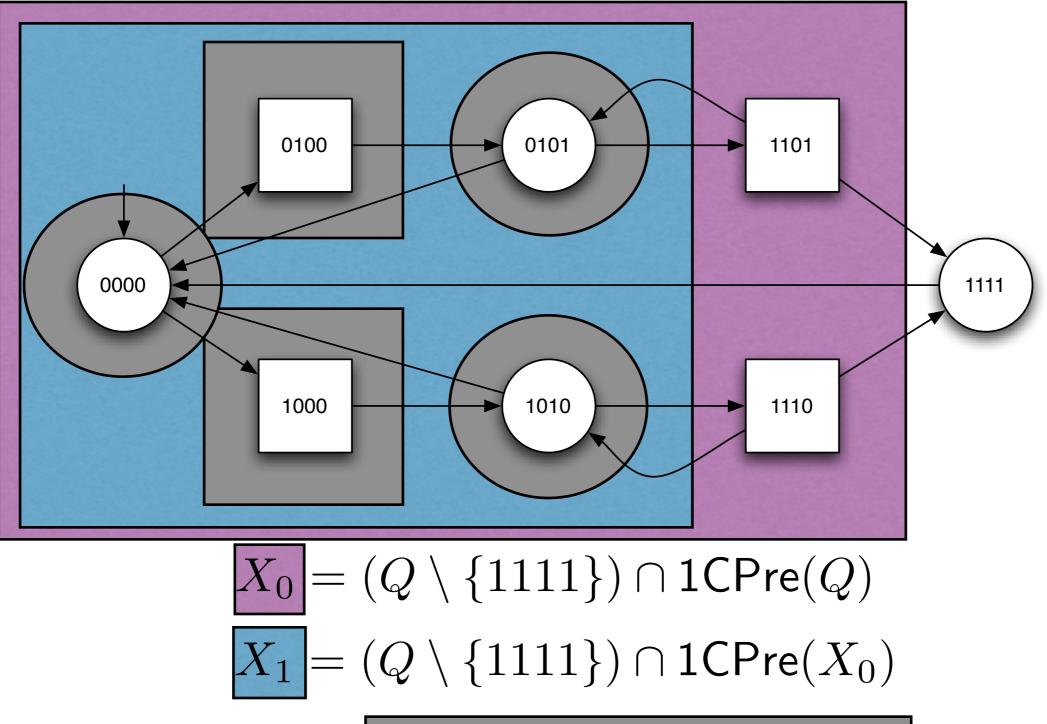




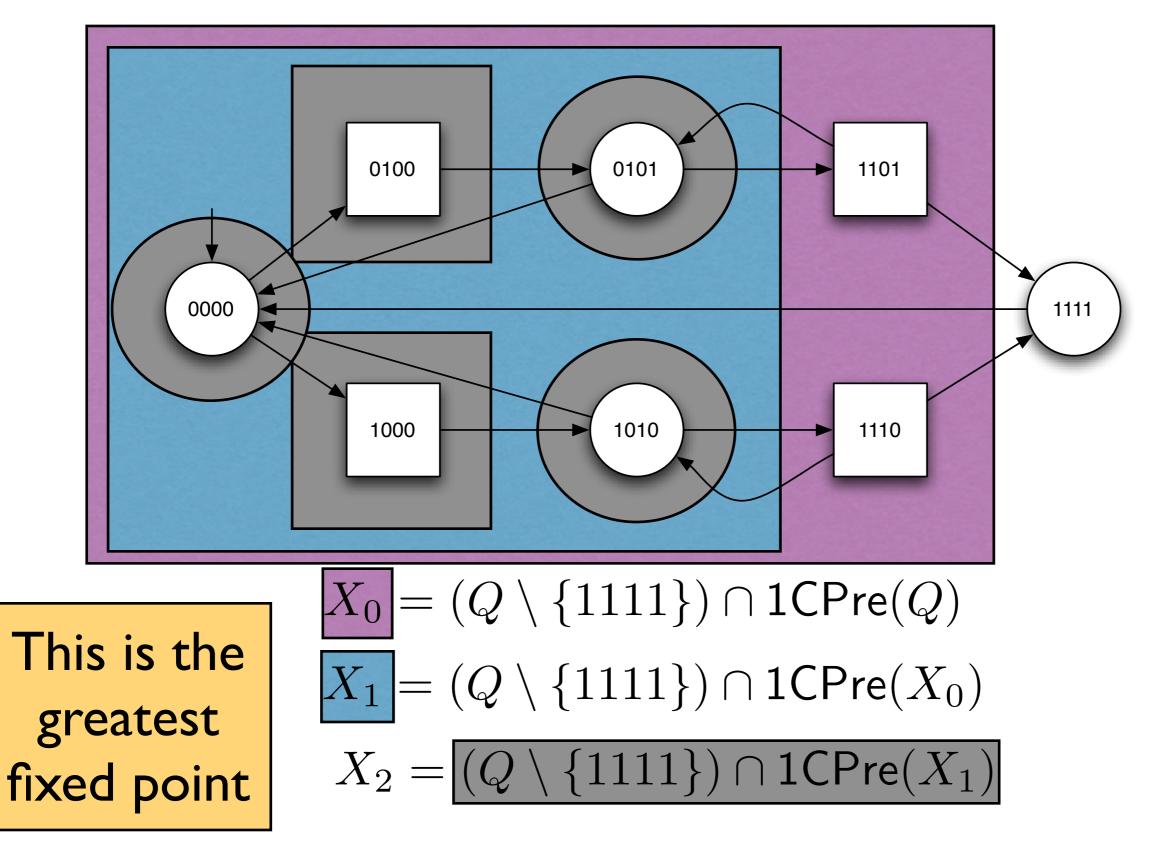
### Fixed points to solve games

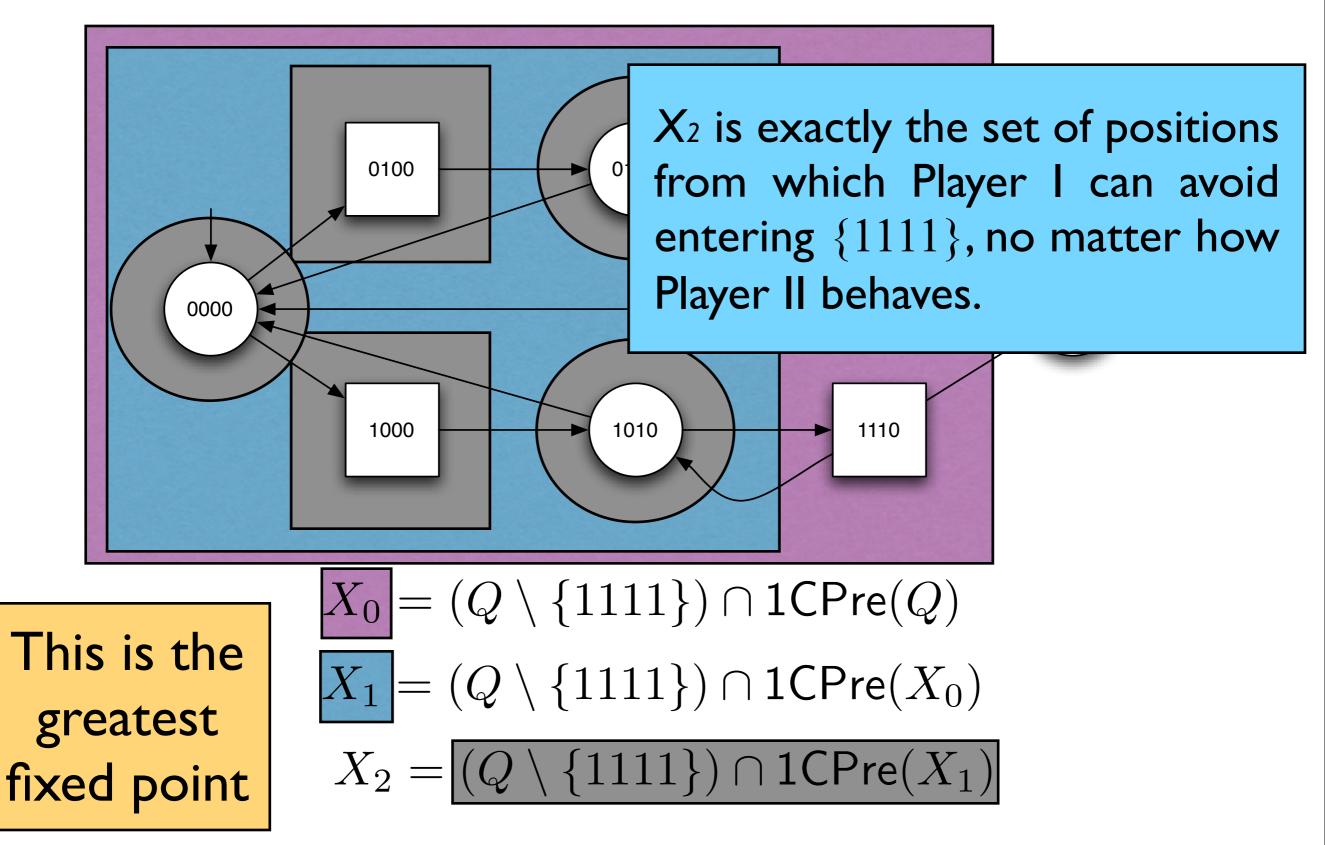
Let Q be a set of safe states, the states in which Player I can force the game to stay within Q is the following greatest fixed point (computed by the previous algorithm):

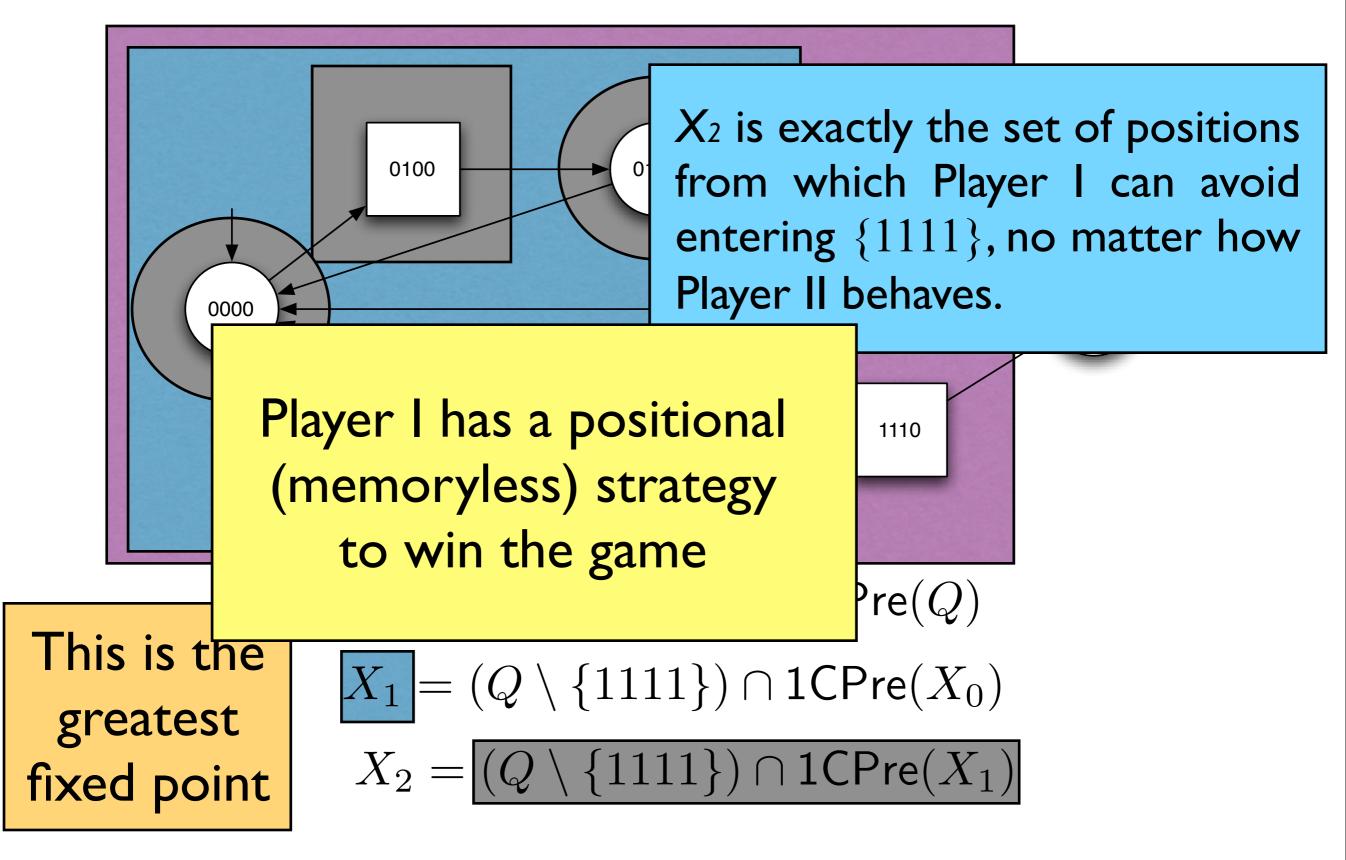
 $\cup \{ R \mid R = Q \cap \mathsf{CPre}_1(R) \}$ 

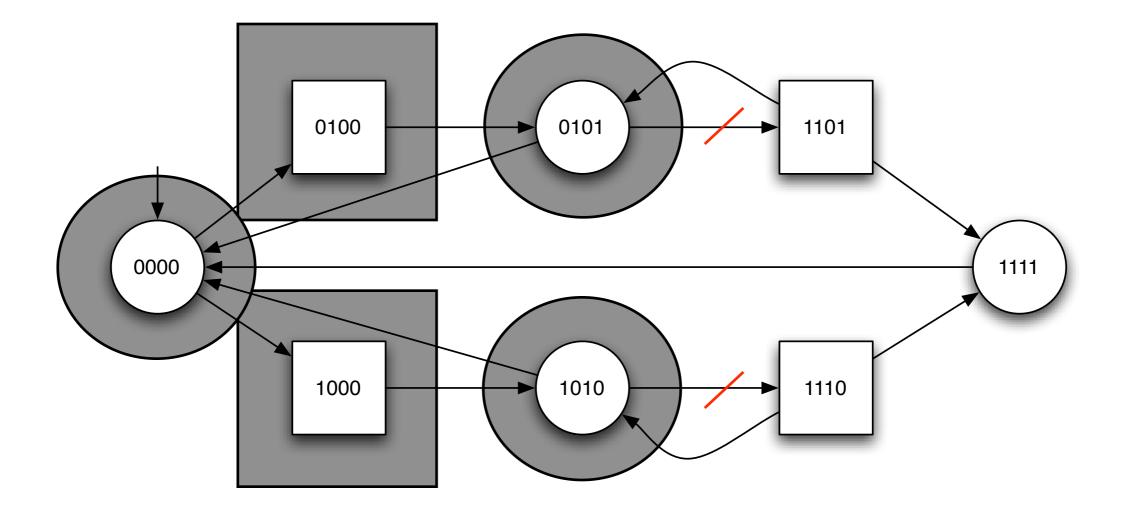


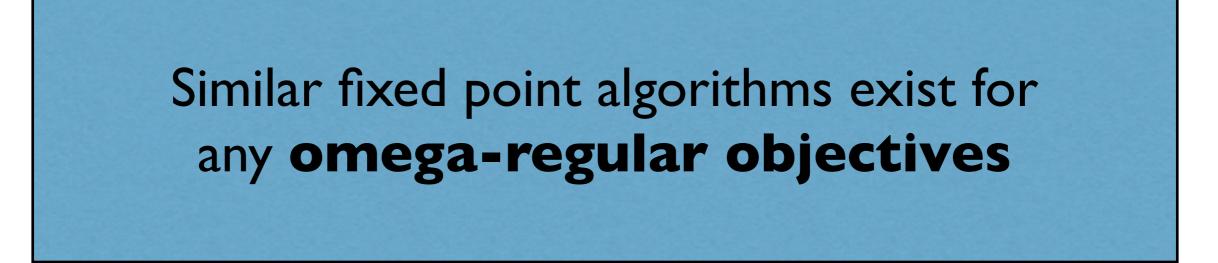
 $X_2 = (Q \setminus \{1111\}) \cap \mathsf{1CPre}(X_1)$ 







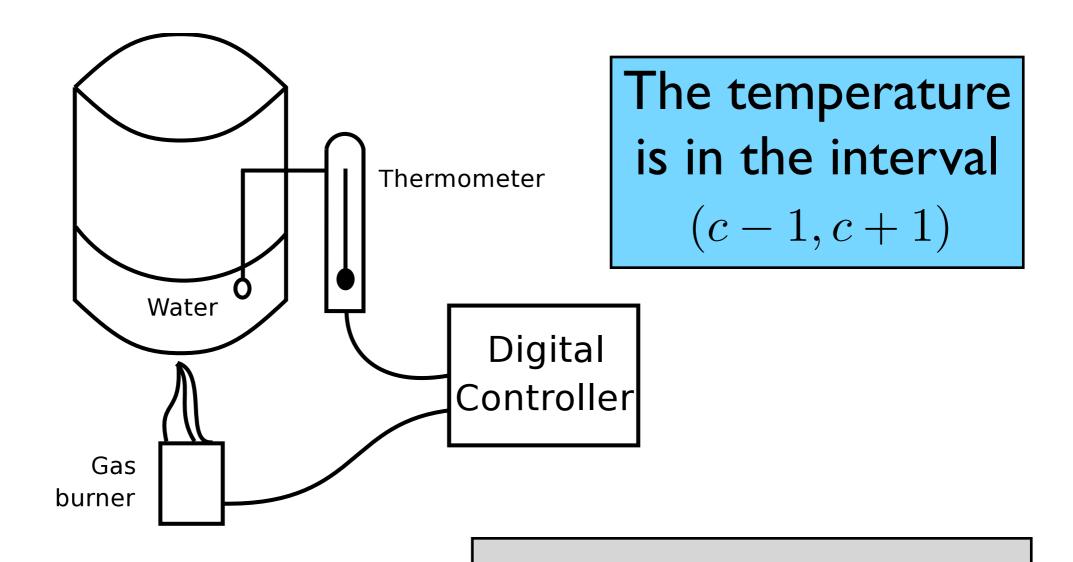




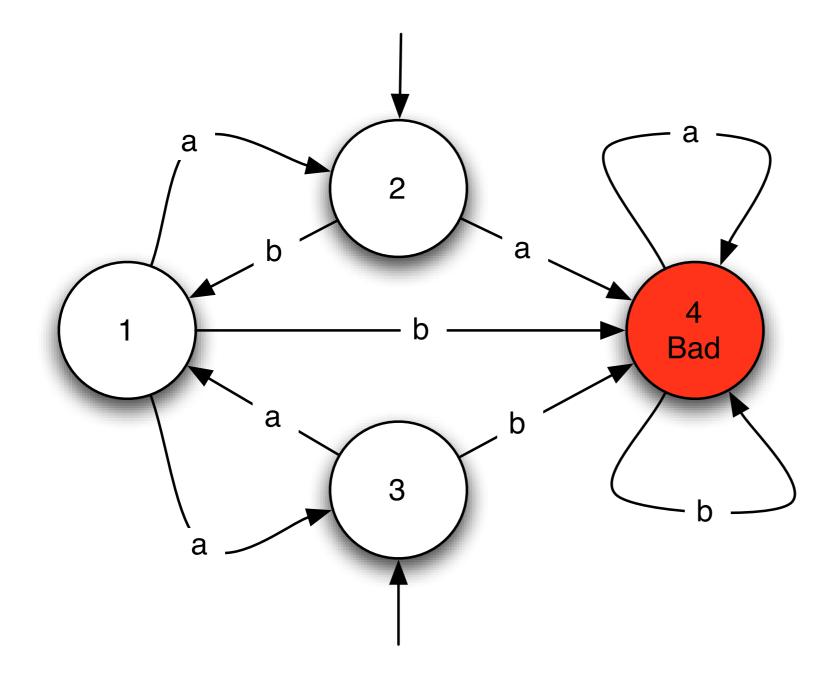
# Games of imperfect information

### Perfect information hypothesis?

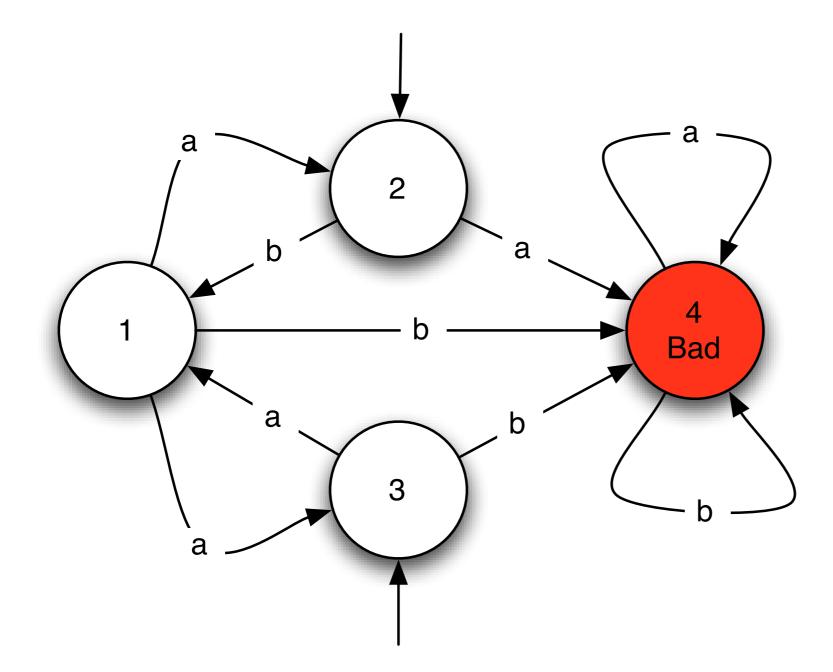
#### Finite precision = imperfect information



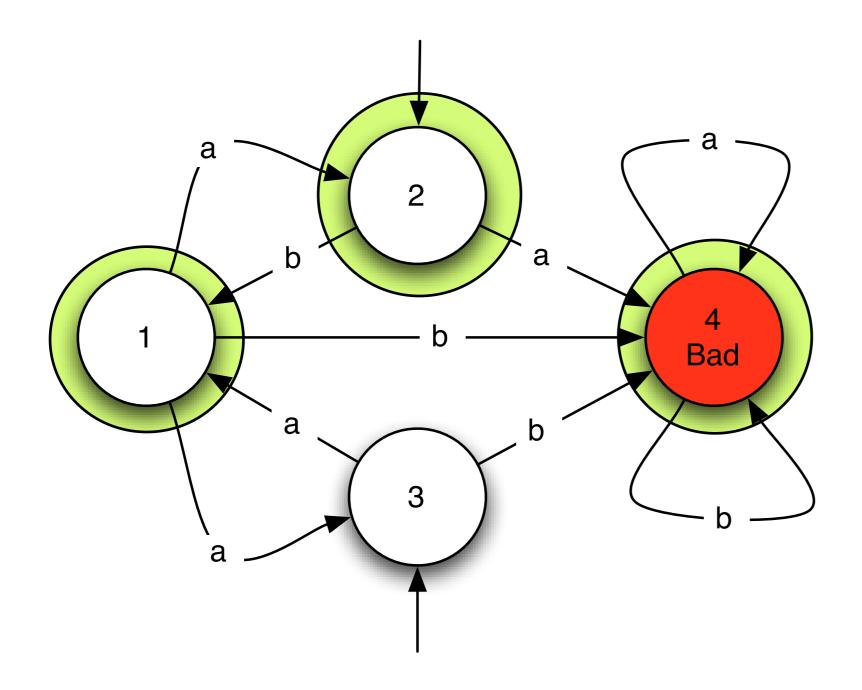
Typical hybrid system



#### Player 0 chooses a letter Player 1 resolves nondeterminism

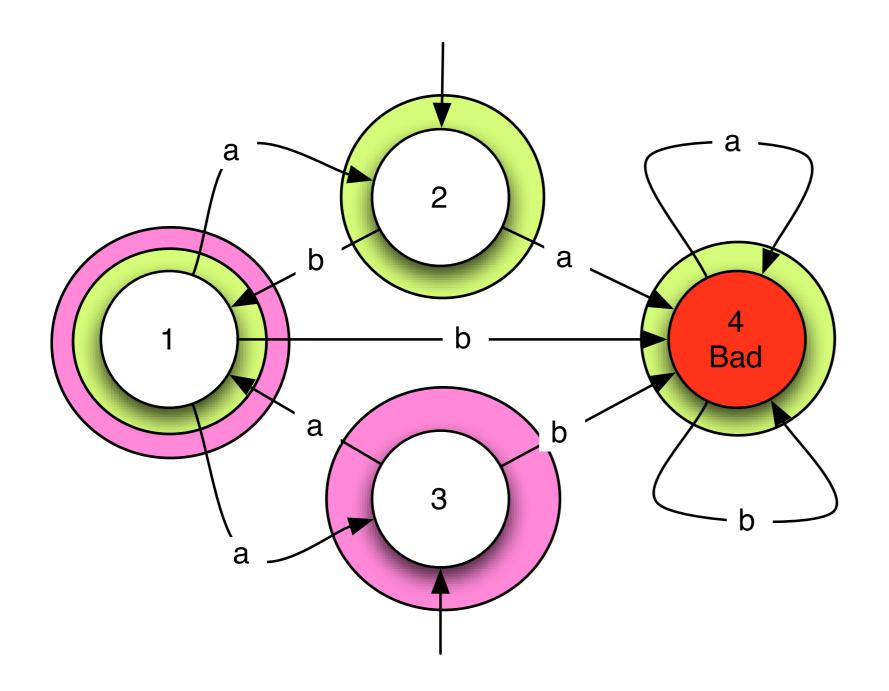


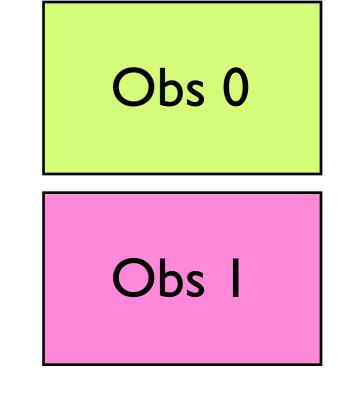
#### Imperfect information



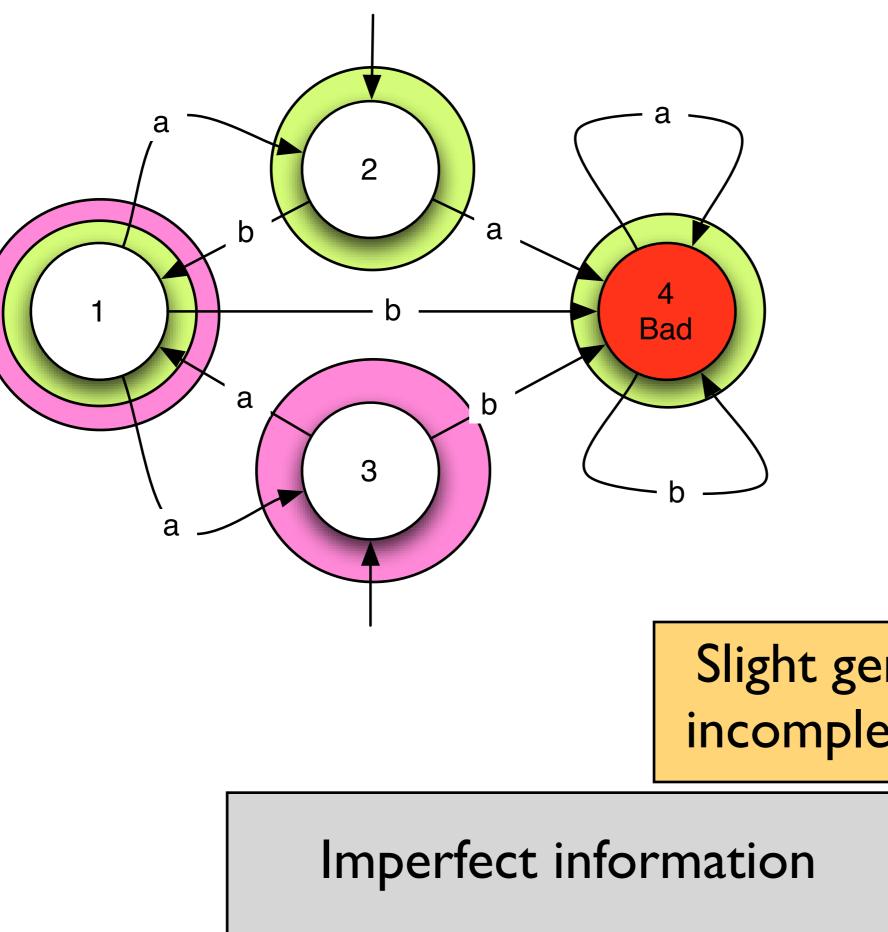
Obs 0

#### Imperfect information





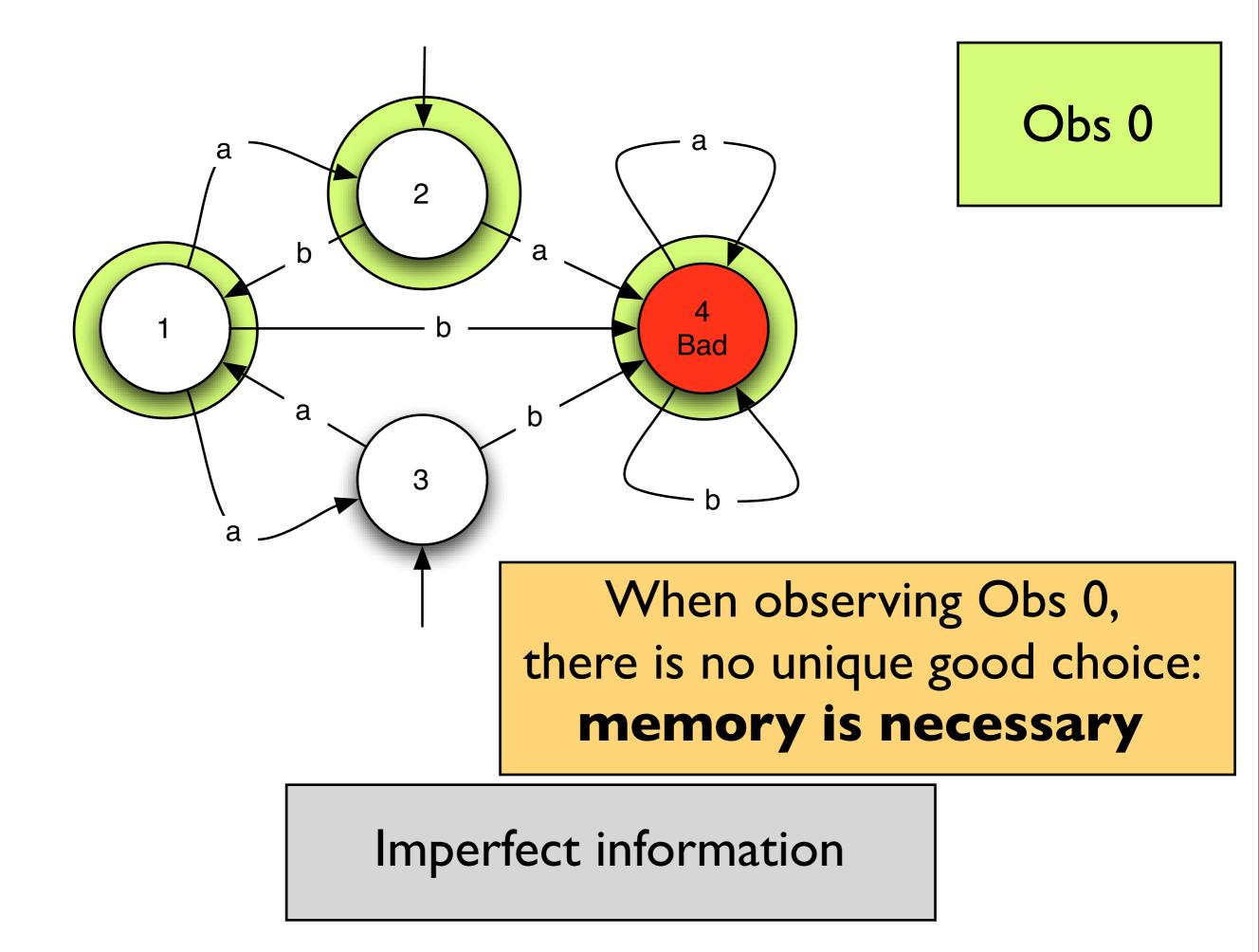
#### Imperfect information





Obs 0

# Slight generalization of incomplete information



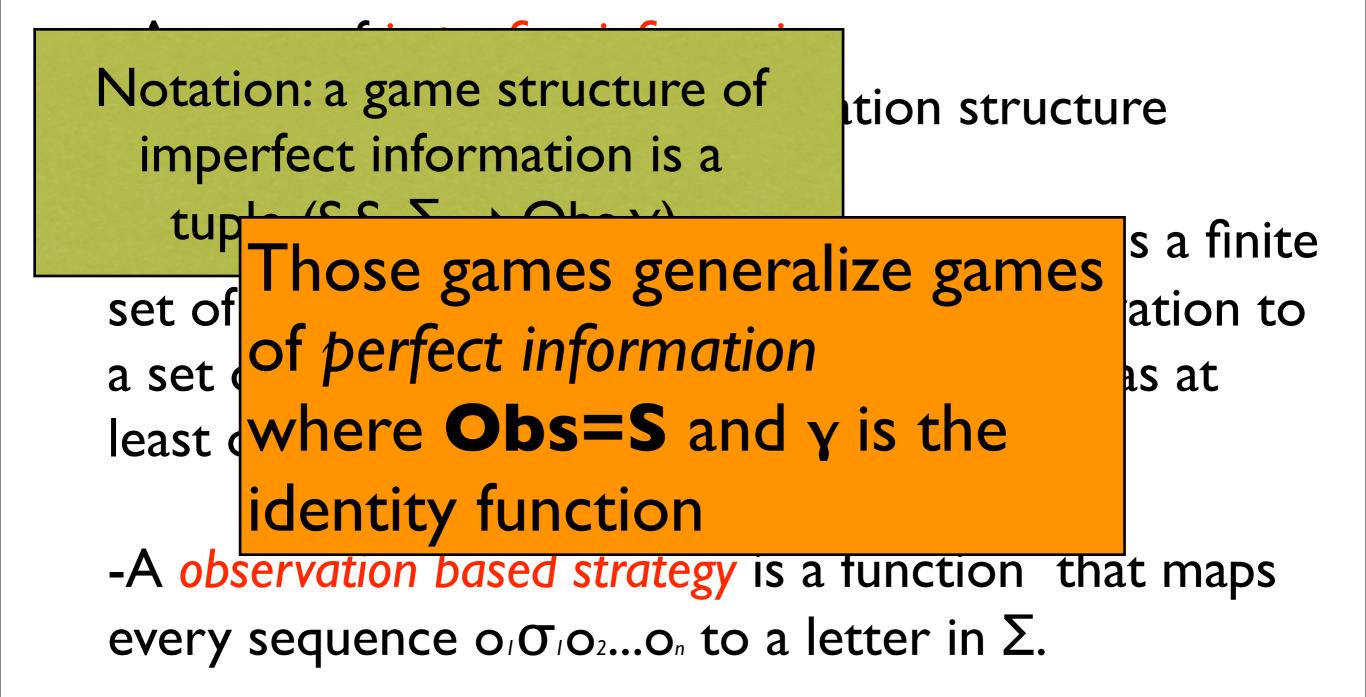
- A game of *imperfect information*: game structure + observation structure

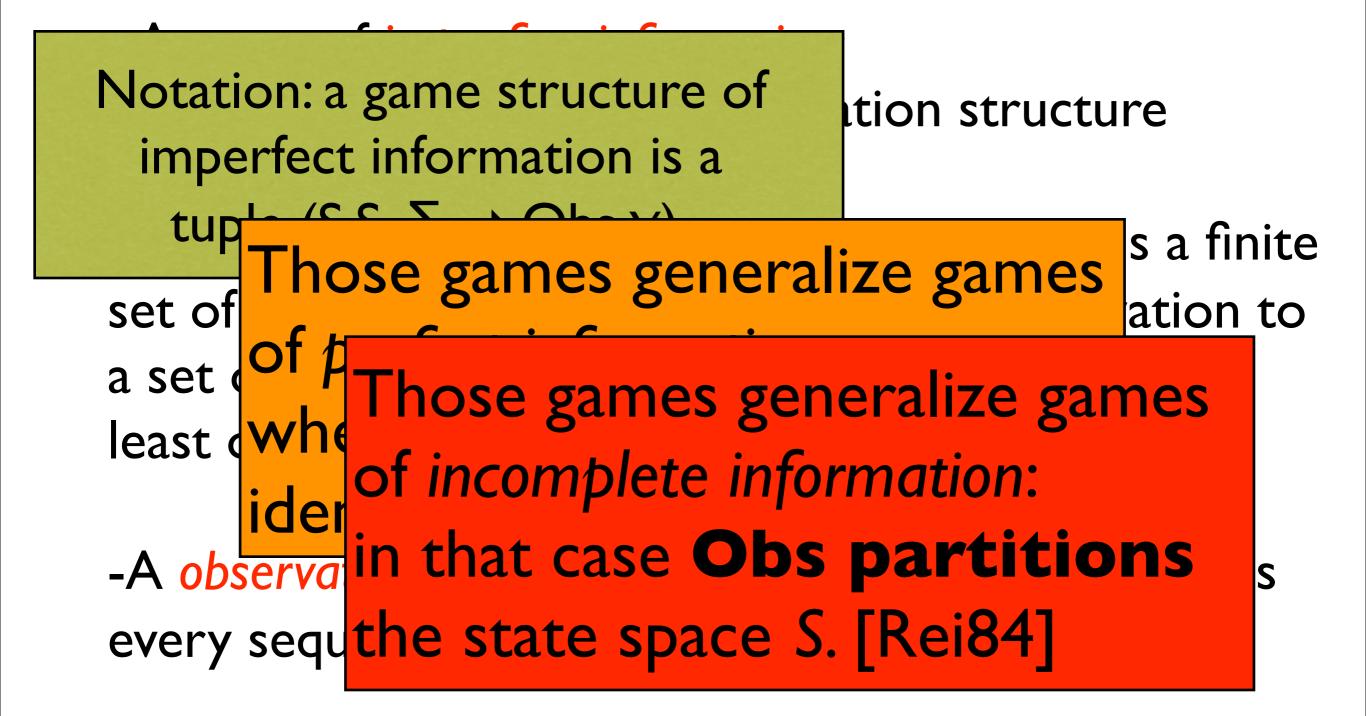
-Observation structure :  $(Obs, \gamma)$  where Obs is a finite set of observations and  $\gamma$  maps every observation to a set of states (we require that every state has at least one observation).

-A observation based strategy is a function that maps every sequence  $o_1 \sigma_1 o_2 \dots o_n$  to a letter in  $\Sigma$ .

Notation: a game structure of imperfect information is a tuple  $(S,S_0,\Sigma,\rightarrow,Obs,\gamma)$ . set of observations and  $\gamma$  maps every observation to a set of states (we require that every state has at least one observation).

-A observation based strategy is a function that maps every sequence  $o_1 \sigma_1 o_2 \dots o_n$  to a letter in  $\Sigma$ .





- To solve games of perfect information :
  - (elegant) fixed point algorithms using a controllable predecessor operator
- To solve games of imperfect information
  - [Reif84] builds a game of perfect information using a knowledge-based subset construction and then solve this games using classical techniques

- To solve games of perfect information :
- (ele After a finite prefix of a game, Player I has a partial knowledge of the current state of the game : a set of states
   To so
  - [Reif84] builds a game of perfect information using a knowledge-based subset construction and then solve this games using classical techniques

• To solve games of perfect information :

(ele After a finite prefix of a game, Player I has
 cor a partial knowledge of the current state of
 the game : a set of states

We propose here a new solution that avoids the **preliminary** explicit subset construction.

ne of perfect knowledge-based and then solve this

games using classical techniques

# We define a controllable predecessor operator for a set of sets of states q

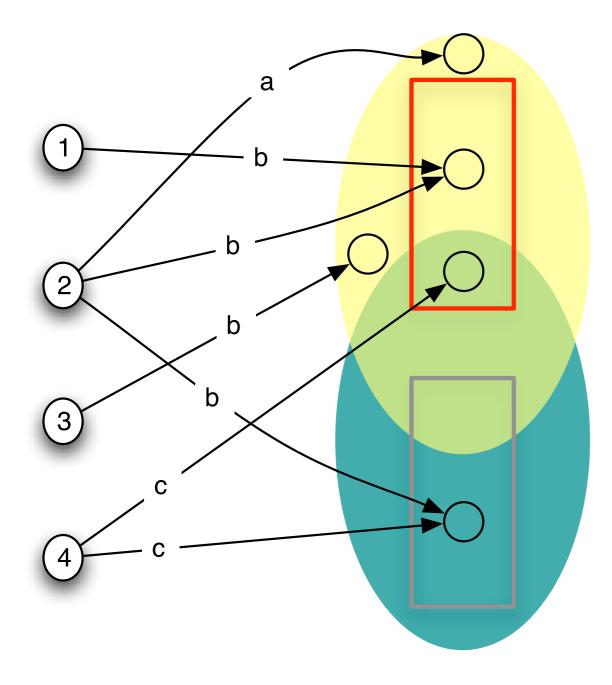
$$\mathsf{CPre}(q) = \{ s \subseteq \mathsf{Bad} \mid \exists \sigma \in \Sigma : \forall \mathsf{obs} \in \mathsf{Obs} : \exists s' \in q : \mathsf{Post}_{\sigma}(s) \cap \gamma(\mathsf{obs}) \subseteq s' \}$$

(i) s does not intersect with **Bad**,

(ii) there exists  $\sigma$ s.t. the set of possible successors of s by  $\sigma$  is

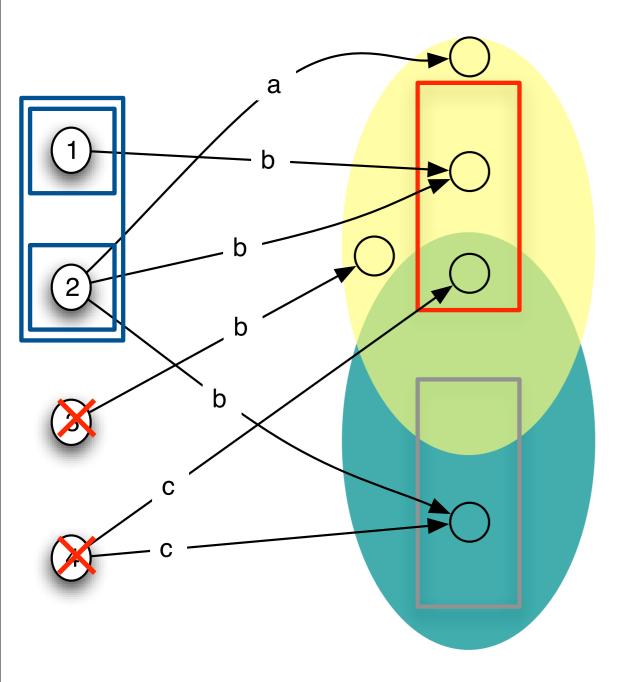
#### covered by *Q*

(a) no matter how the adversary resolves non-determinism,
(b) no matter the compatible observation Obs



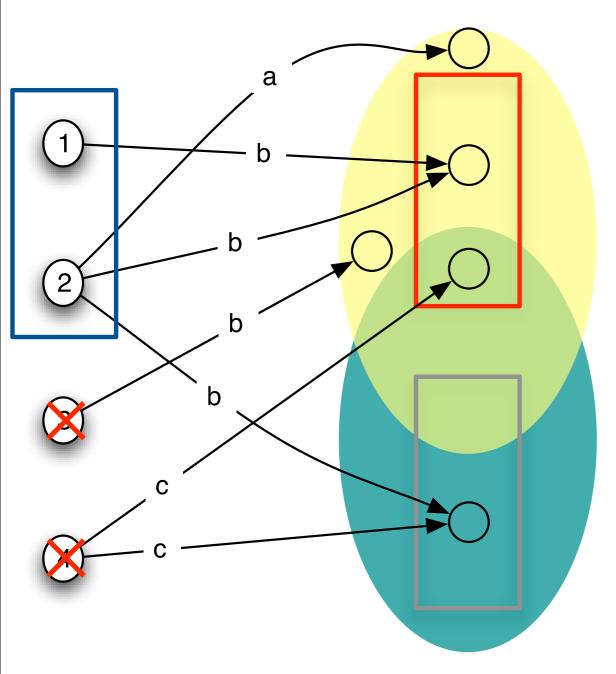


# Example





#### If there is a strategy for set A, there is a strategy for any B included in A



#### It is enough to keep only the **maximal sets**

 $\mathsf{CPre}(q) = [\{s \subseteq \overline{\mathsf{Bad}} \mid \exists \sigma \in \varSigma \cdot \forall \mathsf{obs} \in \mathsf{Obs} \cdot \exists s' \in q : \mathsf{Post}_{\sigma}(s) \cap \gamma(\mathsf{obs}) \subseteq s'\}]$ 

# Antichains

**Definition 4** [Antichain of sets of states] An *antichain* on the partially ordered set  $\langle 2^S, \subseteq \rangle$  is a set  $q \subseteq 2^S$  such that for any  $A, B \in q$  we have  $A \not\subset B$ .

Let us call L the set of antichains on S.

**Definition 5** [ $\sqsubseteq$ ] Let  $q, q' \in 2^{2^S}$  and define  $q \sqsubseteq q'$  if and only if  $\forall A \in q : \exists A' \in q' : A \subseteq A'$ 

 $\mathbf{lub}: \ q_1 \sqcup q_2 = \lceil \{s \mid s \in q_1 \lor s \in q_2\} \rceil$ 

**glb**:  $q_1 \sqcap q_2 = \lceil \{s_1 \cap s_2 \mid s_1 \in q_1 \land s_2 \in q_2\} \rceil$ 

The minimal element is  $\emptyset$ , the maximal element  $\{S\}$ .

 $\langle L, \sqsubseteq \rangle$  is a complete lattice.

 $\begin{array}{l} \mathsf{CPre}(q) = \left[ \{ s \subseteq \overline{\mathsf{Bad}} \mid \exists \sigma \in \varSigma \cdot \forall \mathsf{obs} \in \mathsf{Obs} \cdot \exists s' \in q : \mathsf{Post}_{\sigma}(s) \cap \gamma(\mathsf{obs}) \subseteq s' \} \right] \\ \bullet & \mathsf{CPre} \text{ is a monotone function over} \\ & \mathsf{the lattice of antichains} \end{array}$ 

CPre has a least and a greatest fixed point

# Advantage : we only keep the needed information to find a strategy

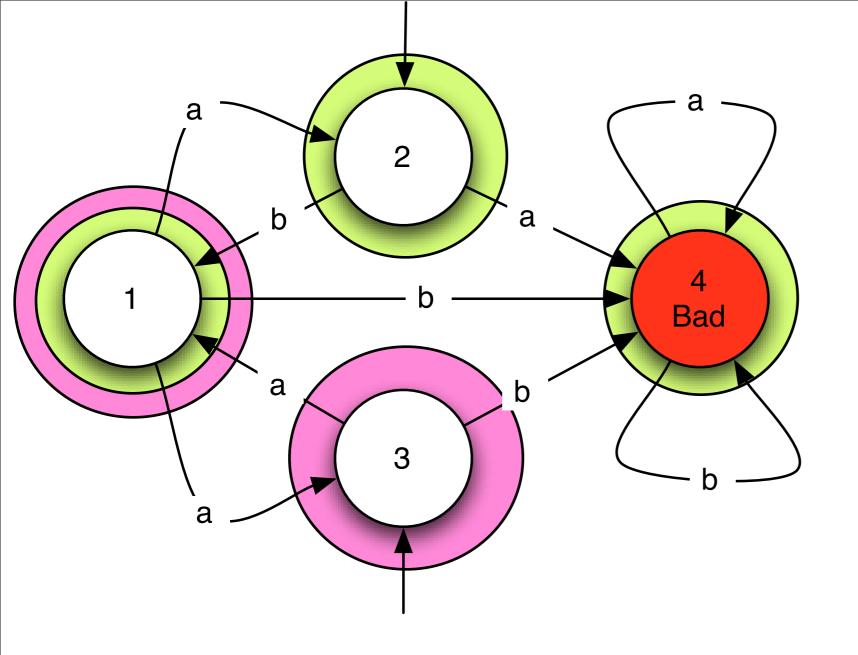
## Main theorem

Let 
$$G = \langle S, S_0, \Sigma, \rightarrow, Obs, \gamma \rangle$$

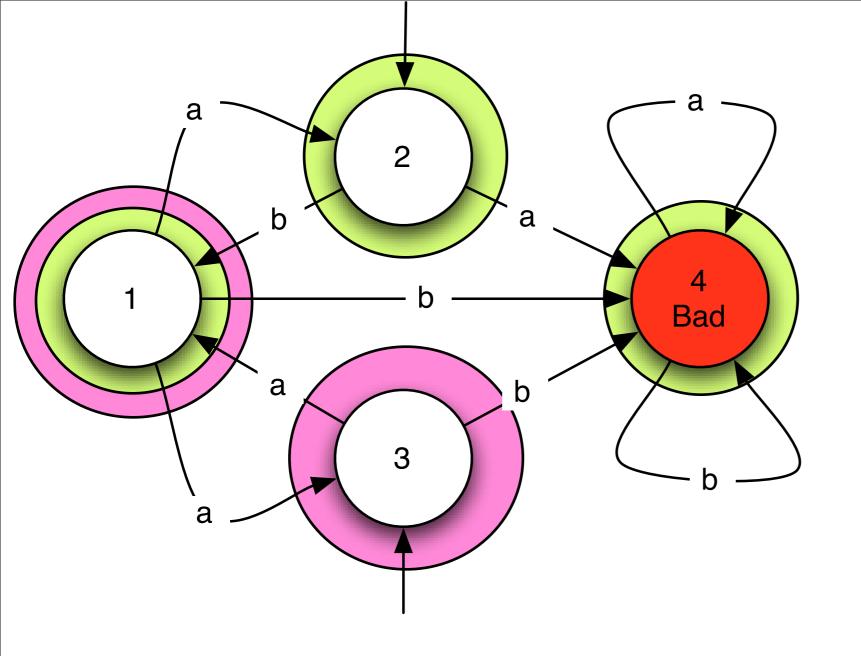
be a two-player game of imperfect information. Player I has a winning observation based strategy to avoid Bad, **iff** 

 $\{S_0 \cap \gamma(\mathsf{obs}) \mid \mathsf{obs} \in \mathsf{Obs}\} \sqsubseteq \bigcup \{q \mid q = \mathsf{CPre}(q)\}.$ 

We can extract a strategy from the fixed point

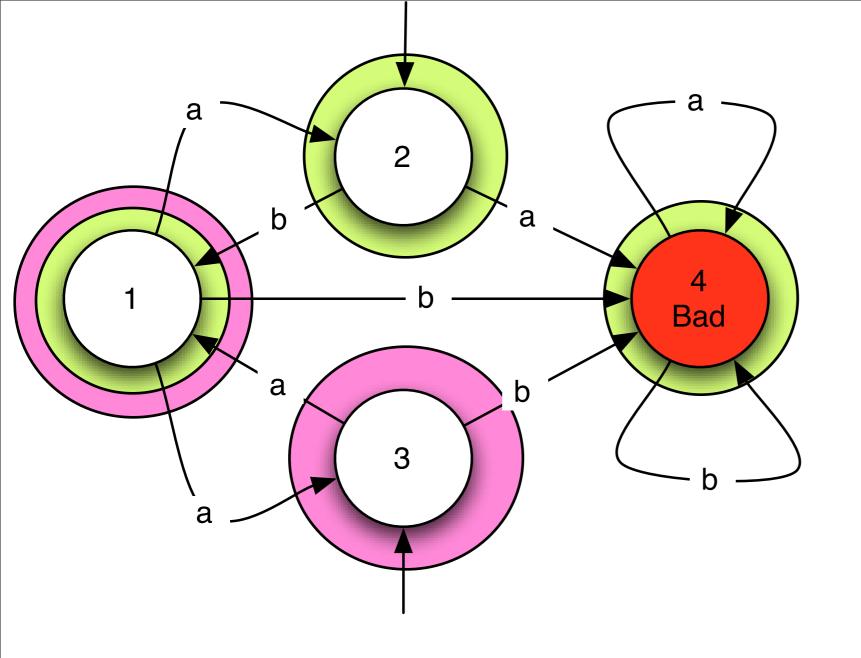


Does Player 0 have an observation based strategy to avoid Bad ?

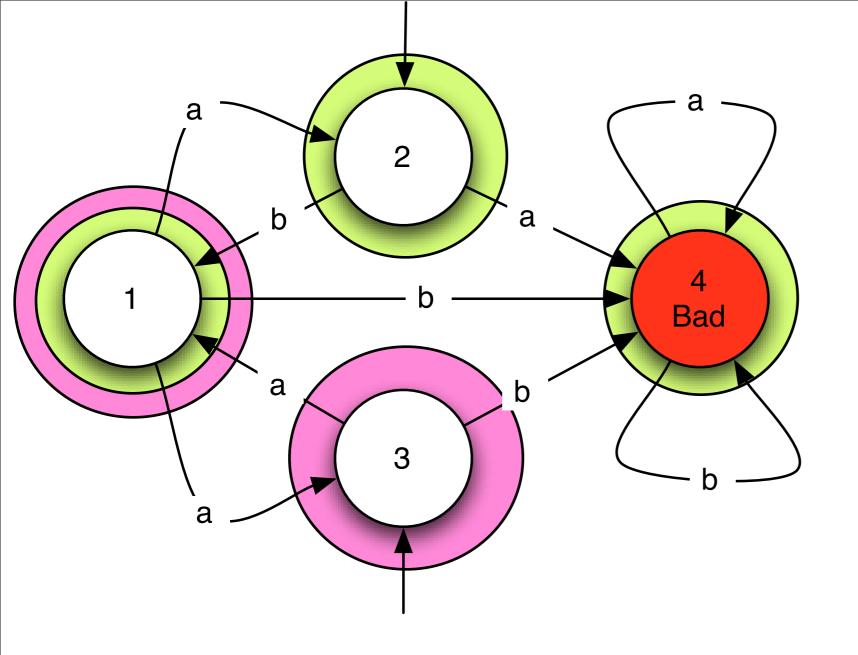


Does Player 0 have an observation based strategy to avoid Bad ?

Let us compute the gfp of CPre over L.

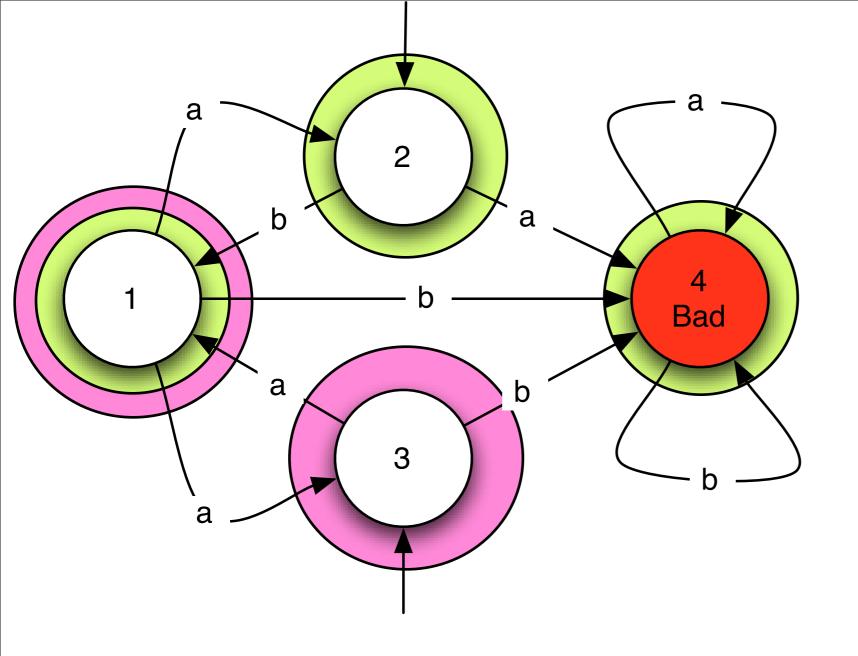


 $q_0 = \top$  $q_1 = \{\{1, 2, 3\}_{a, b}\}$ 



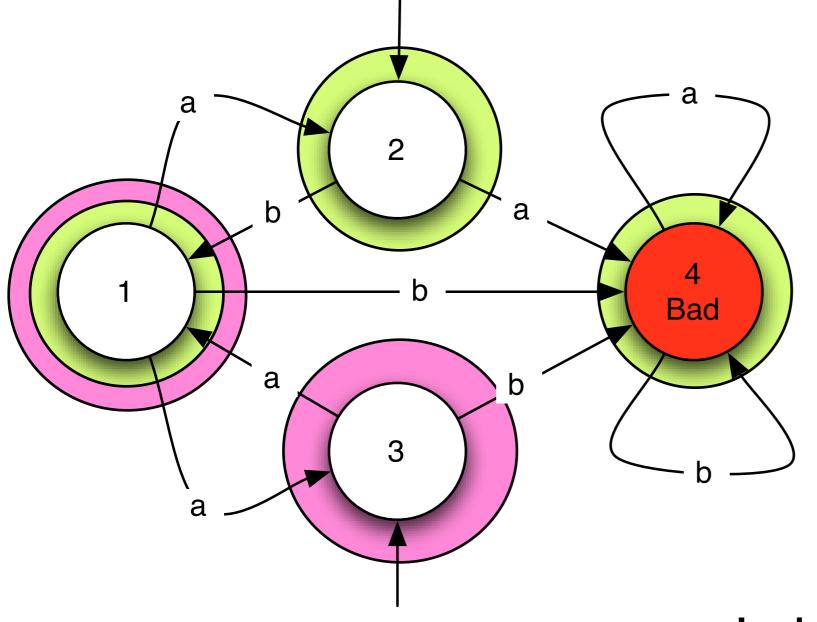
 $q_0 = \top$  $q_1 = \{\{1, 2, 3\}_{a, b}\}$ 

### $q_2 = \mathsf{CPre}(\{\{1, 2, 3\}\})$



 $q_0 = \top$  $q_1 = \{\{1, 2, 3\}_{a, b}\}$ 

# $q_2 = \mathsf{CPre}(\{\{1, 2, 3\}\})$ $= \{\{2\}_b, \{1, 3\}_a\}$

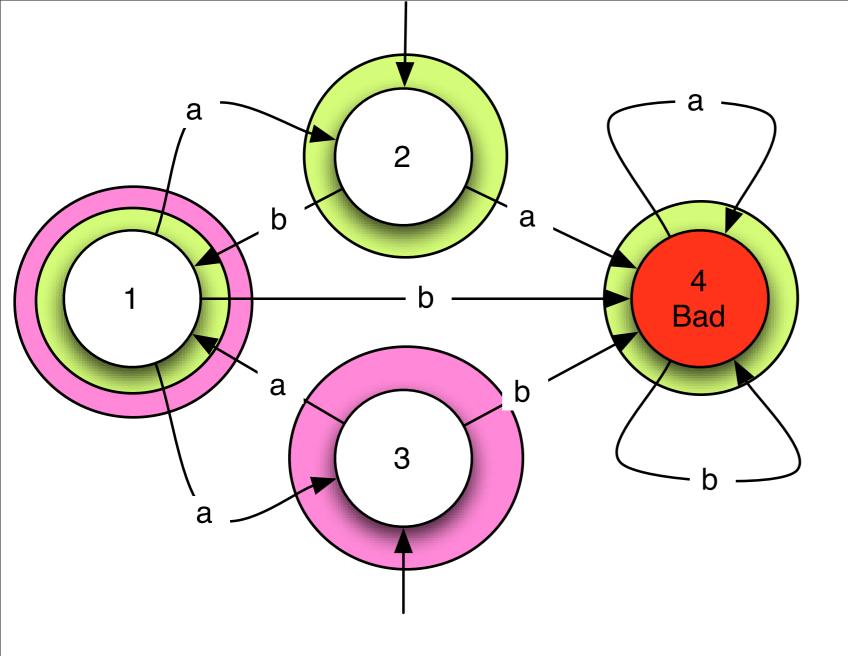


 $q_0 = \top$  $q_1 = \{\{1, 2, 3\}_{a, b}\}$ 

 $q_2 = \mathsf{CPre}(\{\{1, 2, 3\}\})$  $= \{\{2\}_b, \{1, 3\}_a\}$ 

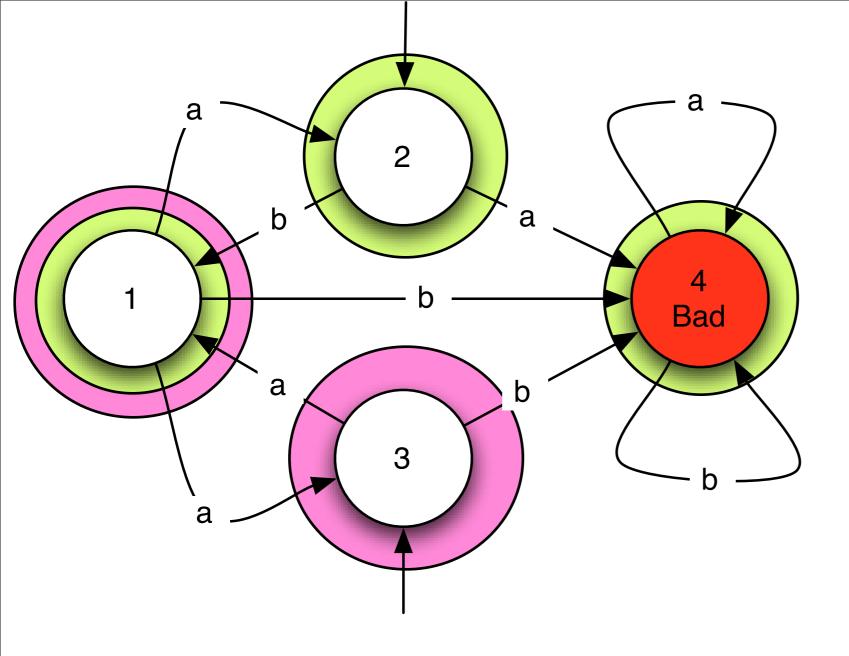
### Indeed,

 $\begin{aligned} \mathsf{Post}_a(\{1,3\}) \cap \{1,2,4\} &\subseteq \{1,2,3\} \\ \mathsf{Post}_a(\{1,3\}) \cap \{1,3\} \subseteq \{1,2,3\} \\ \mathsf{Post}_b(\{2\}) \cap \{1,3\} \subseteq \{1,2,3\} \\ \mathsf{Post}_b(\{2\}) \cap \{1,2,4\} \subseteq \{1,2,3\} \end{aligned}$ 



 $q_0 = \top$  $q_1 = \{\{1, 2, 3\}_{a, b}\}$  $q_2 = \{\{2\}_b, \{1,3\}_a\}$ 

### $q_3 = \mathsf{CPre}(\{\{2\}, \{1, 3\}\})$

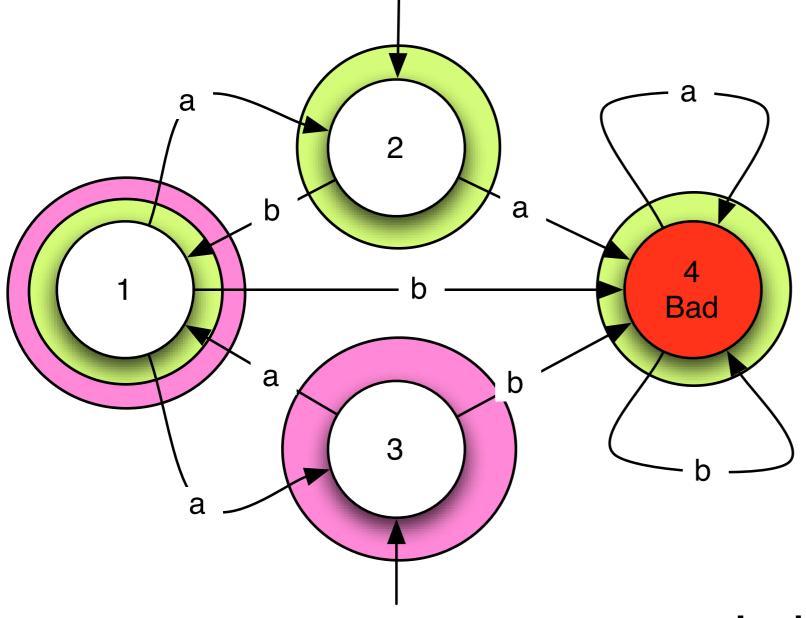


$$q_0 = \top$$

$$q_1 = \{\{1, 2, 3\}_{a, b}\}$$

$$q_2 = \{\{2\}_b, \{1, 3\}_a\}$$

$$q_3 = \mathsf{CPre}(\{\{2\}, \{1,3\}\})$$
$$= \{\{1\}_a, \{2\}_b, \{3\}_a\}$$

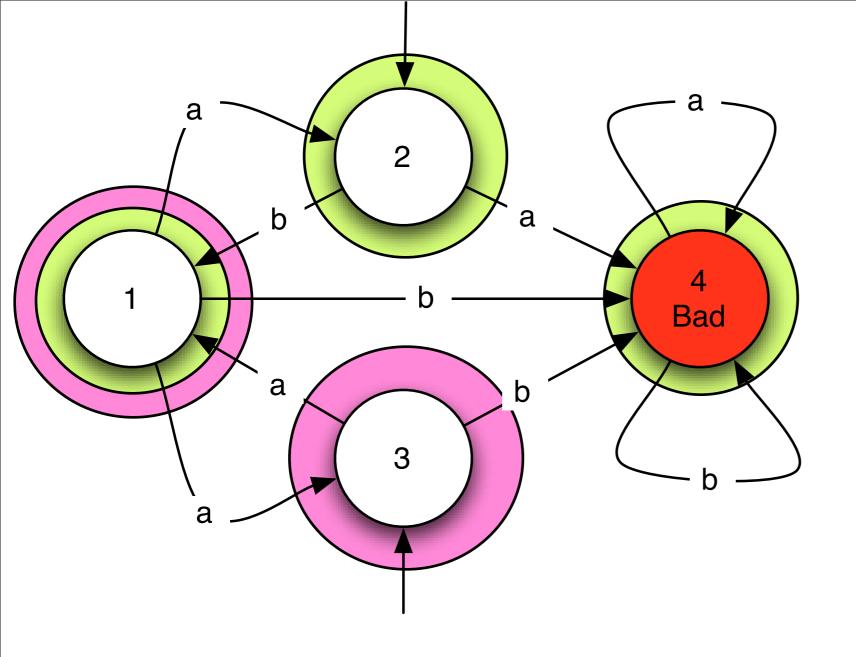


 $q_0 = \top$  $q_1 = \{\{1, 2, 3\}_{a, b}\}$  $q_2 = \{\{2\}_b, \{1,3\}_a\}$ 

 $q_3 = \mathsf{CPre}(\{\{2\}, \{1, 3\}\})$  $= \{\{1\}_a, \{2\}_b, \{3\}_a\}$ 

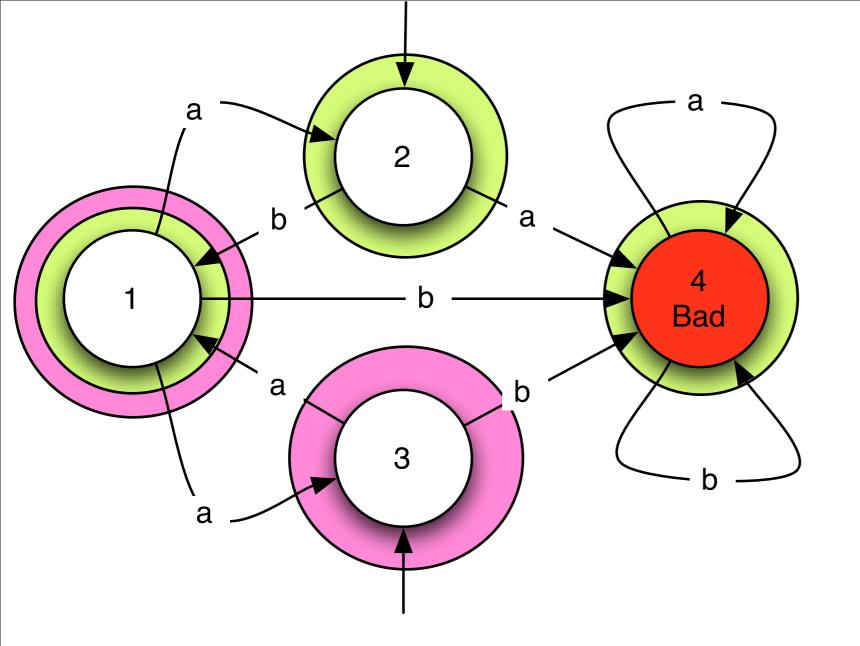
### Indeed,

Post<sub>a</sub>({1})  $\cap$  {1, 2, 4}  $\subseteq$  {2} Post<sub>a</sub>({1})  $\cap$  {1, 3}  $\subseteq$  {3} Adding any state would break this property



 $q_0 = \top$  $q_1 = \{\{1, 2, 3\}_{a,b}\}\$  $q_2 = \{\{2\}_b, \{1,3\}_a\}$  $q_3 = \{\{1\}_a, \{2\}_b, \{3\}_a\}$  $q_4 = \{\{1\}_a, \{2\}_b, \{3\}_a\}$ 

### Fixed point



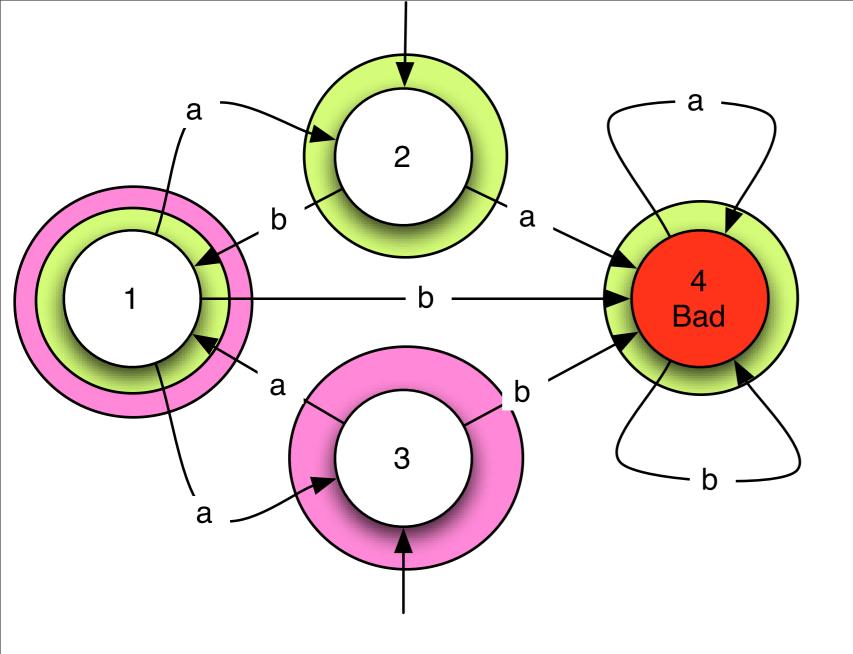
 $q_{0} = \top$   $q_{1} = \{\{1, 2, 3\}_{a, b}\}$   $q_{2} = \{\{2\}_{b}, \{1, 3\}_{a}\}$   $q_{3} = \{\{1\}_{a}, \{2\}_{b}, \{3\}_{a}\}$   $q_{4} = \{\{1\}_{a}, \{2\}_{b}, \{3\}_{a}\}$ 

### Fixed point

### We have

 $\{\{2,3\} \cap \mathsf{Obs}_0, \{2,3\} \cap \mathsf{Obs}_1\} \sqsubseteq \sqcup \{q \mid q = \mathsf{CPre}(q)\}$ 

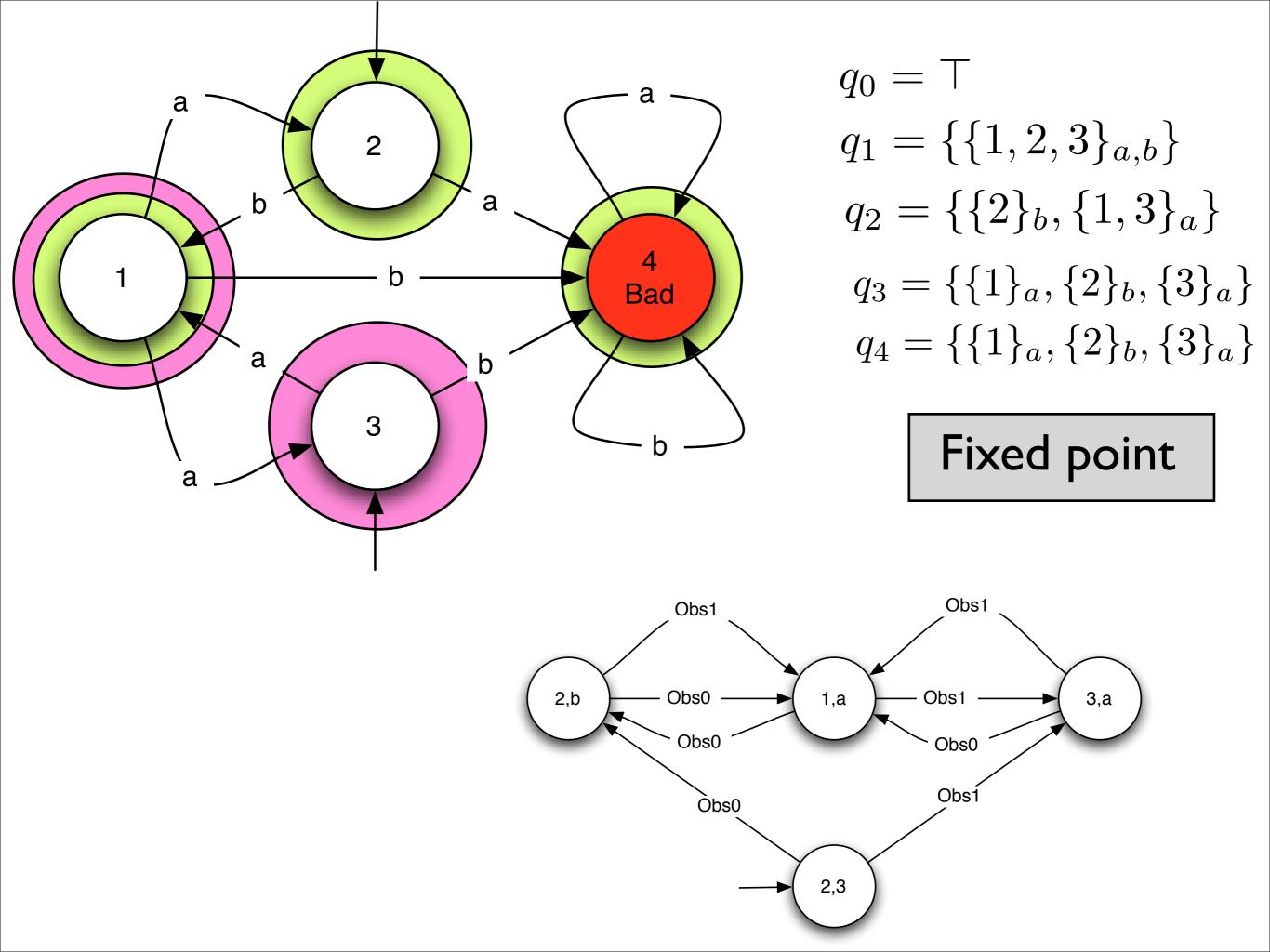
and so, Player 0 has an observation based winning strategy to avoid Bad



 $q_{0} = \top$   $q_{1} = \{\{1, 2, 3\}_{a, b}\}$   $q_{2} = \{\{2\}_{b}, \{1, 3\}_{a}\}$   $q_{3} = \{\{1\}_{a}, \{2\}_{b}, \{3\}_{a}\}$   $q_{4} = \{\{1\}_{a}, \{2\}_{b}, \{3\}_{a}\}$ 

### Fixed point

### We can extract a strategy from the fixed point



# Complexity for finite state games

- The imperfect information control problem is **EXPTIME-complete**
- There exist finite state games of incomplete information for which the algorithm of [Rei84] requires an exponential time where our algorithm needs only polynomial time

# Complexity for finite state games

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   We compute exactly what is needed to control, the system

control the system for a given objective

# Infinite state games

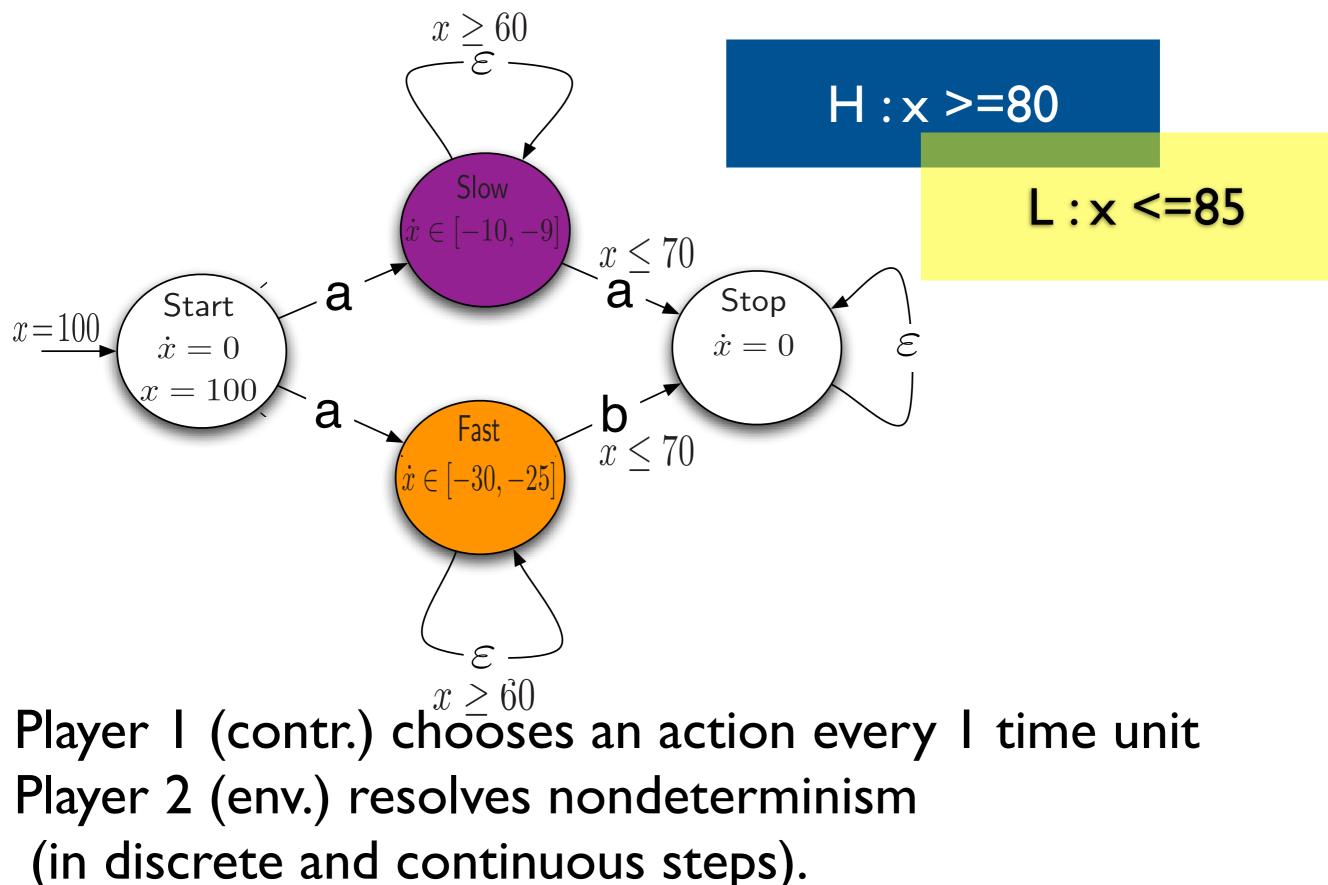
We can drop the assumption that S if finite

Our fixed point algorithm will terminate if

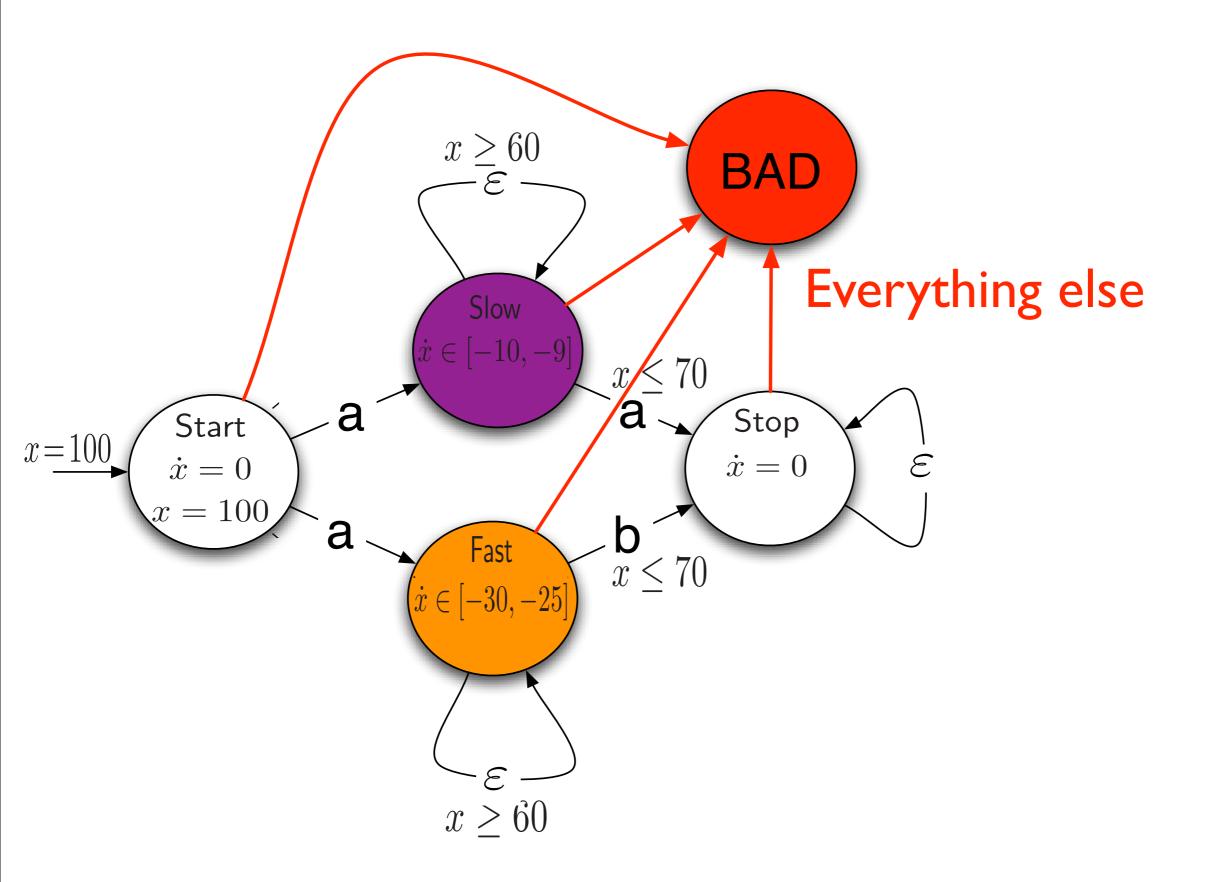
There exists a finite quotient of the state space in which Post, Enabled,  $\gamma$  are definable using this quotient

**Application : Discrete Time Control of RHA** 

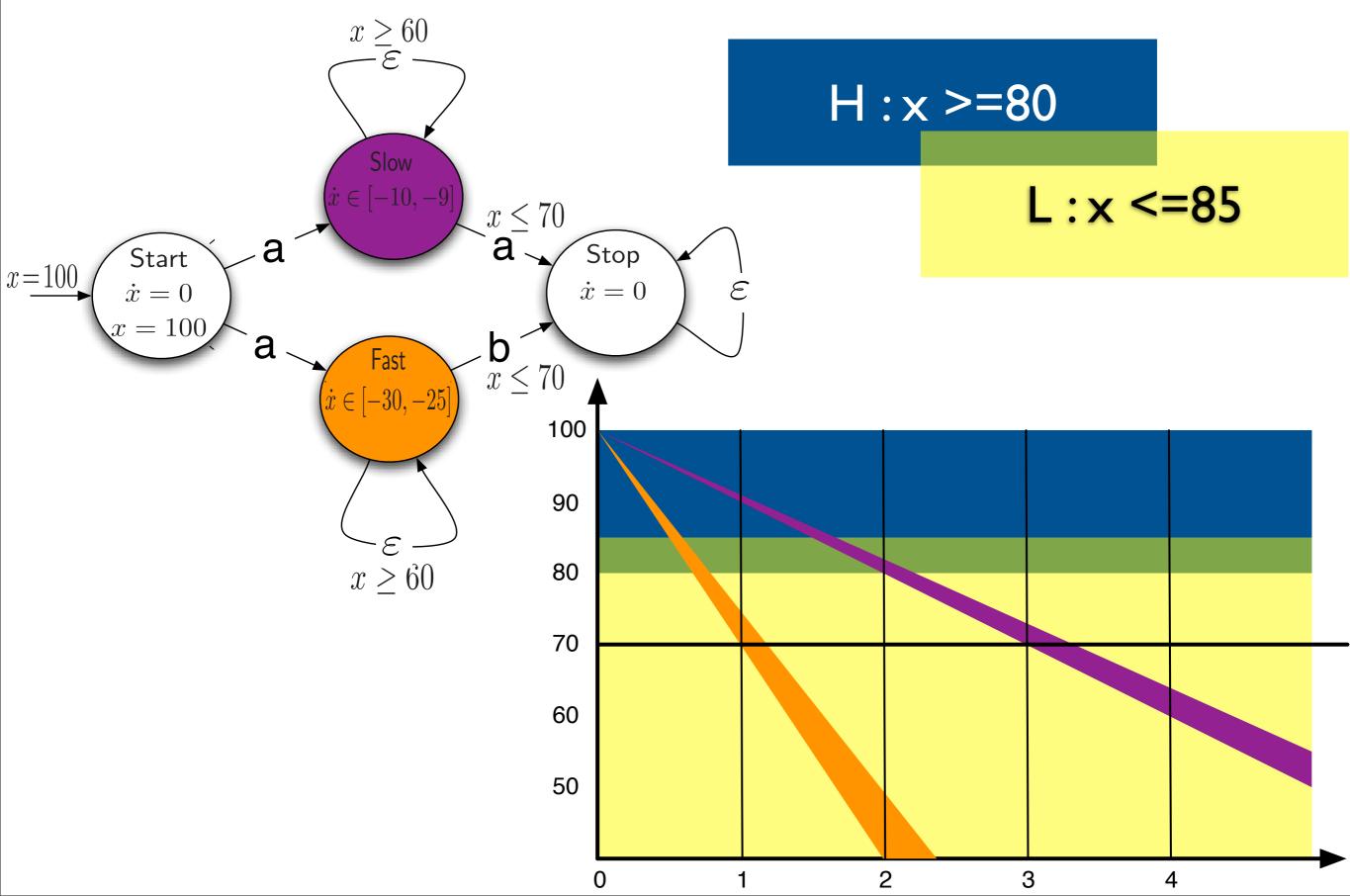
### Discrete time control of RHA

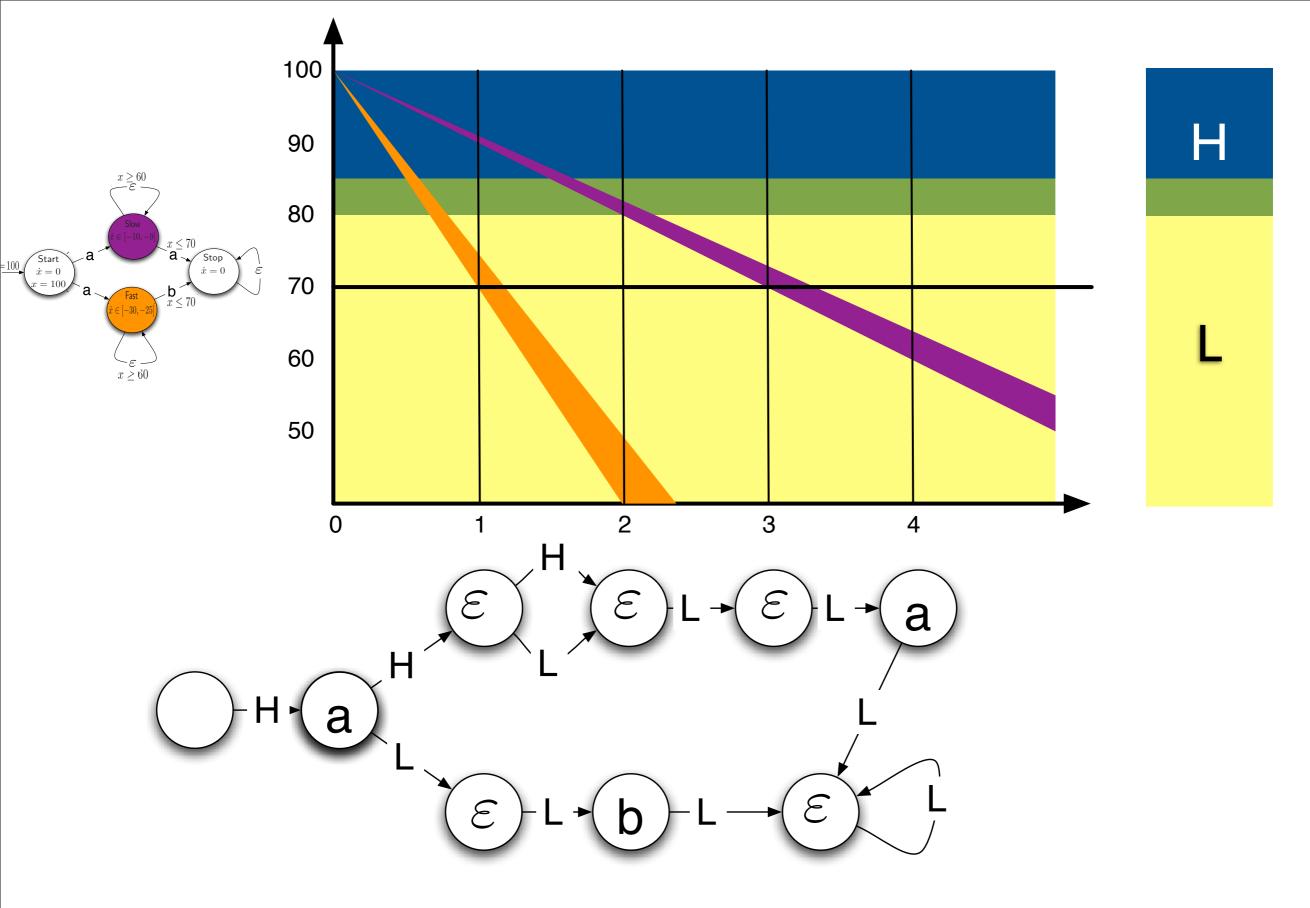


### Discrete time control of RHA

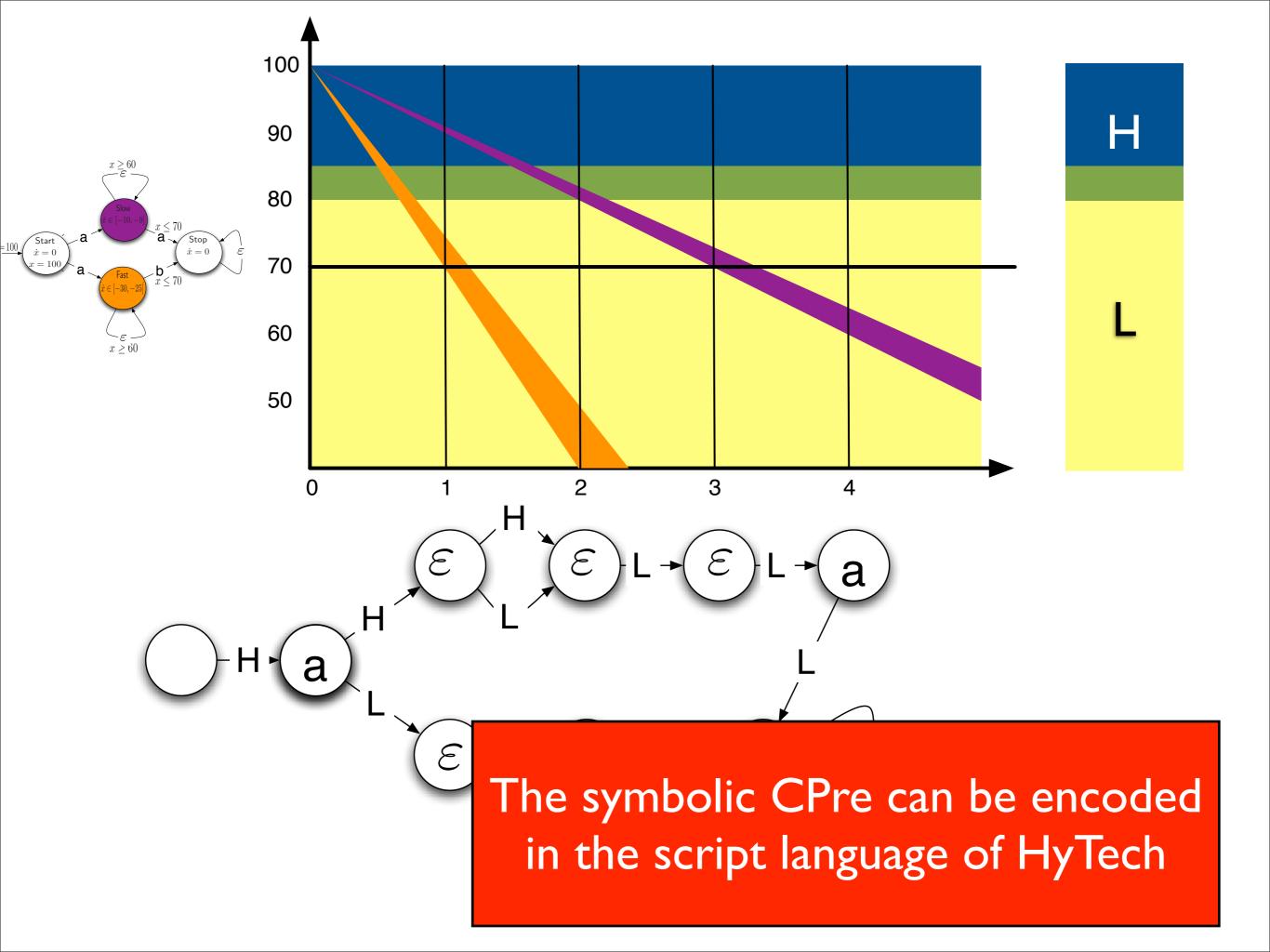


### Discrete time control of RHA

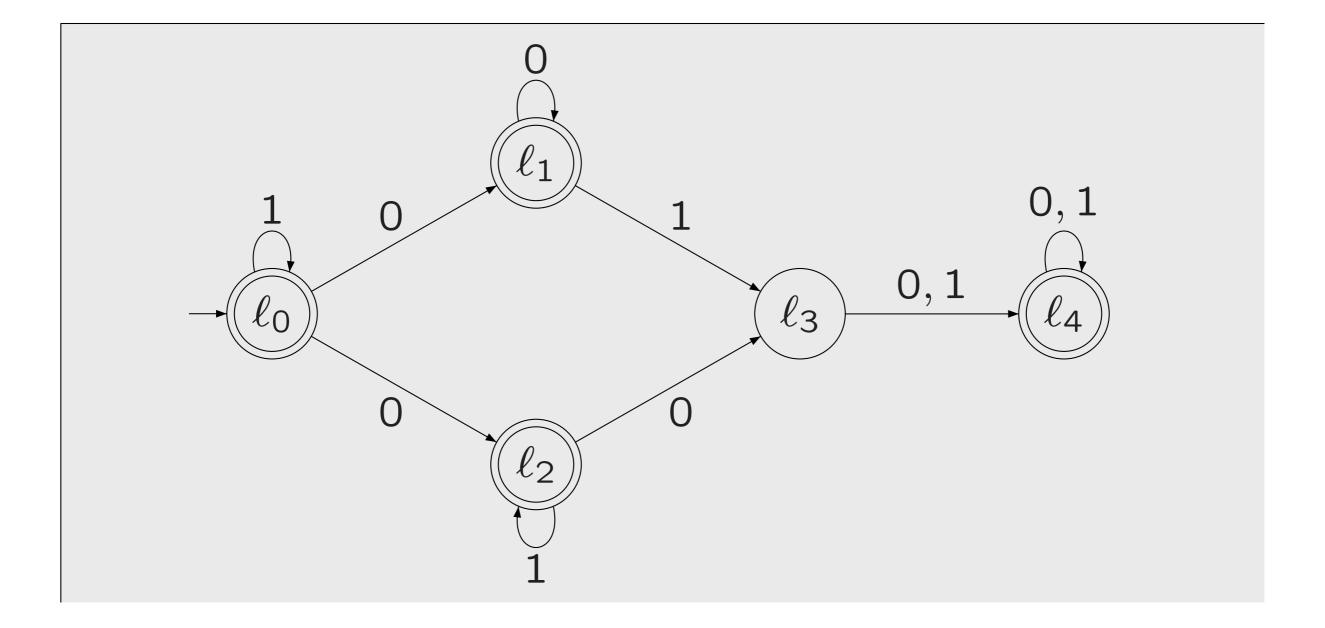




The Strategy



## Universality of NFA



# Universality of NFA

Consider a game played by a protagonist and an antagonist

The protagonist wants to establish that  $\mathcal{A}$  is not universal.

The protagonist has to provide a finite word w such that no matter how the antagonist reads it using A, the automaton ends up in a rejecting location.

 $\implies$  This is a one-shot game.

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Consider a game played by a protagonist and an antagonist

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The game is turn-based: the protagonist provides the word w one letter at a time, and the antagonist updates the state of A. The protagonist cannot observe the state chosen by the antagonist.

 $\implies$  This is a blind game (or game of null information).

Let  $\mathcal{A} = \langle \mathsf{Loc}, \ell_I, \Sigma, \delta_A, F \rangle$ .

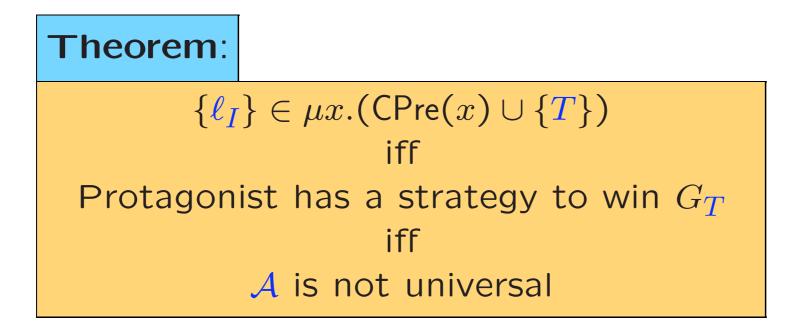
Consider the following controllable predecessor operator over sets of sets of locations. For  $q \subseteq 2^{\text{Loc}}$ , let:

$$\mathsf{CPre}(q) = \{s \mid \exists s' \in q \cdot \exists \sigma \in \Sigma \cdot \forall \ell \in s \cdot \forall \ell' \in \mathsf{Loc} : \delta_A(\ell, \sigma, \ell') \to \ell' \in s'\}$$

So  $s \in CPre(q)$  if there is a set  $s' \in q$  that is reached from any location in s, reading input letter  $\sigma$ , that is  $Post_{\sigma}(s) \subseteq s'$ .

 $\implies$  CPre encodes the blindness of the game.

Let 
$$\mathcal{A} = \langle \mathsf{Loc}, \ell_I, \Sigma, \delta_A, F \rangle$$
.



**Claim**: For  $s_1 \subseteq s_2$ , if  $\text{Post}_{\sigma}(s_2) \subseteq s'$  then  $\text{Post}_{\sigma}(s_1) \subseteq s'$ and if  $s_2 \in \text{CPre}(\cdot)$ , then  $s_1 \in \text{CPre}(\cdot)$ 

**Idea**: Keep in CPre(x) only the maximal elements.

### Universality - Experimental results (1)

• We compare our algorithm Antichains with the best<sup>(1)</sup> known algorithm dk.brics.automaton by Anders Møller.

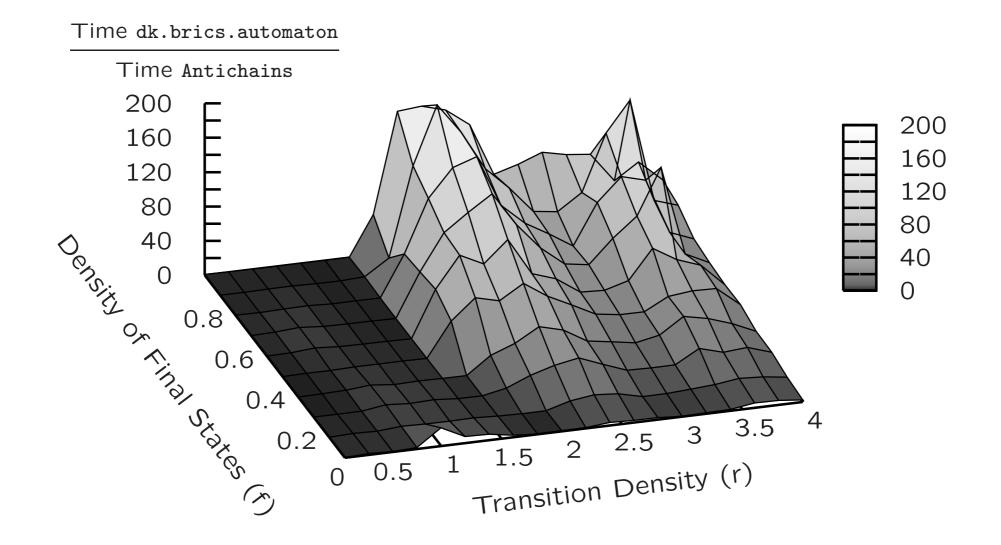
<sup>(1)</sup> According to "D. Tabakov, M. Y. Vardi. Experimental Evaluation of Classical Automata Constructions. LPAR 2005".

• We use a randomized model to generate the instances (automata of 175 locations). Two parameters:

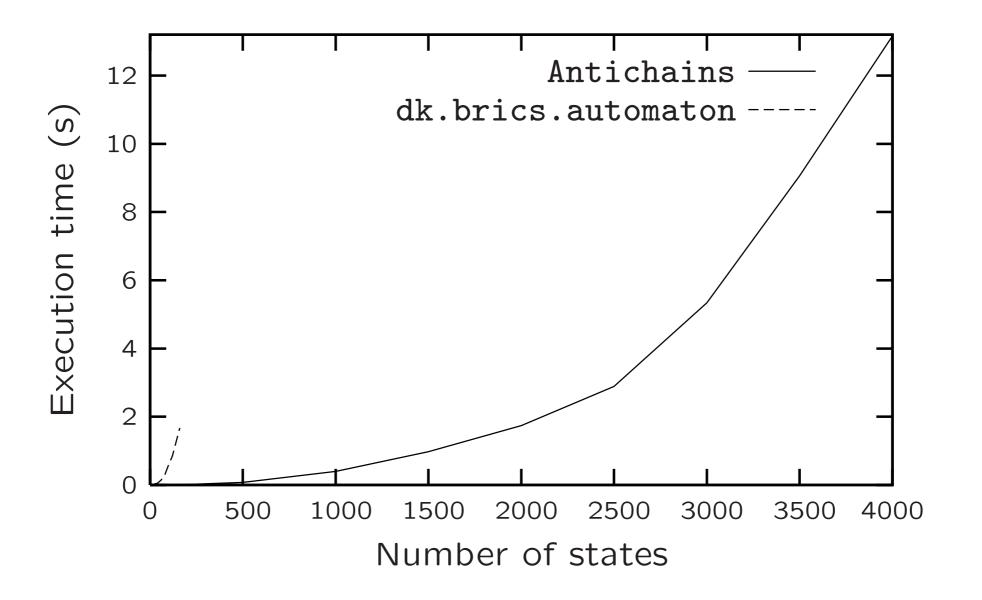
- Transition density:  $r \ge 0$ 

– Density of accepting states:  $0 \le f \le 1$ 

#### Universality - Experimental results (2)



Each sample point: 100 automata with |Loc| = 175,  $\Sigma = \{0, 1\}$ .



- Transition density: r = 2.
- Density of accepting states: f = 1.

### Works also for

- language inclusion between NFA
- emptiness of AFA

• See proceedings of next CAV !

(joint work with Martin De Wulf, Laurent Doyen and Tom Henzinger)

## Conclusion/Perspectives

- We propose a lattice theory to solve games of imperfect information, those games are needed to make the synthesis of robust controllers (= finite precision). (see HSCC06)
- Our technique computes only the information that is needed to find a winning strategy, i.e. we **avoid** the explicit subset construction. Works for any regular objective (see CSL06)
- Applicable to **discrete time control** (see HSCC06) of RHA and useful to solve efficiently **classical problems** for NFA and AFA (see CAV06) and for automata on infinite words (submitted for publication)
- Perspectives : continuous time control, finite automata on infinite words, efficient implementation issues, etc.

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